Computer-assisted proofs: Disk packings on the plane

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- Introduction
- Definitions
- Mexagonal packing is optimal
- Multi-disk packings
- 6 Homework

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Optimal coin packing

Given infinite number of identical coins

how to place them on an infinite plane without overlap to maximize the covered surface?

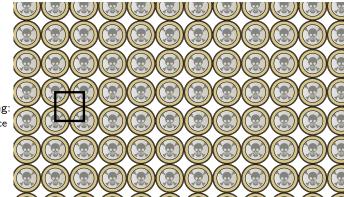


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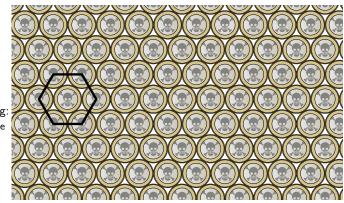
square coin packing: covers 78% of the surface

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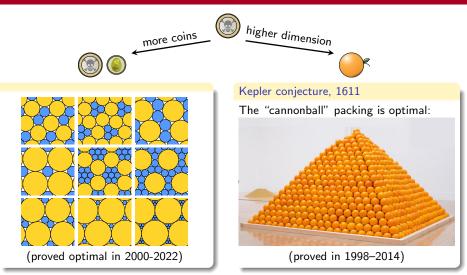


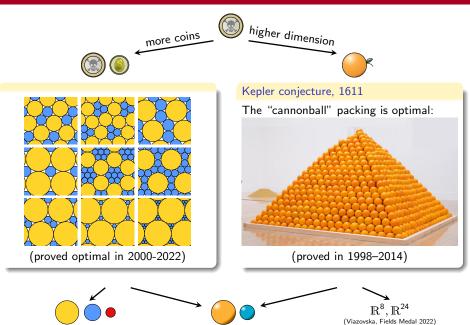
hexagonal coin packing: covers 90% of the surface

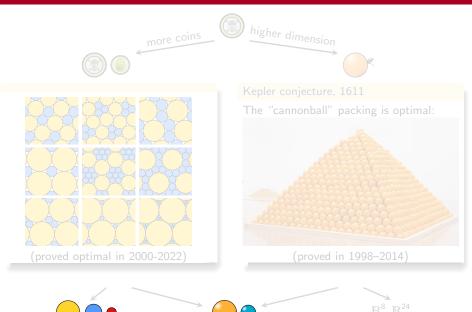
1910-1940

The hexagonal coin packing is optimal.

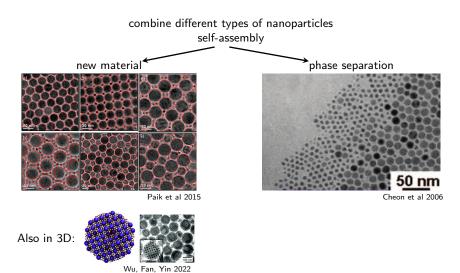








Nanomaterials and packings



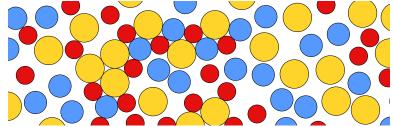
Chemists' question: which sizes and concentrations allow for new materials?

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Disks:



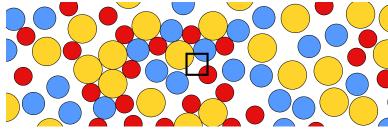
Packing P: (in \mathbb{R}^2)



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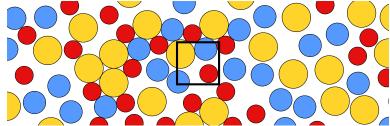
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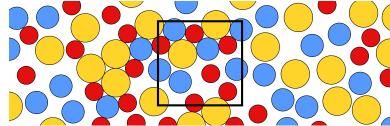


$$\delta\left(n; \overset{n}{\blacksquare} \cap P\right) := \frac{\operatorname{area}\left(n; \overset{n}{\blacksquare} \cap P\right)}{\operatorname{area}\left(n; \overset{n}{\blacksquare}\right)}$$

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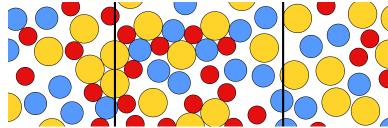


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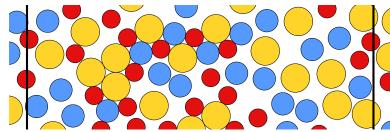


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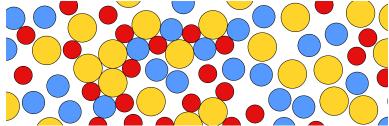


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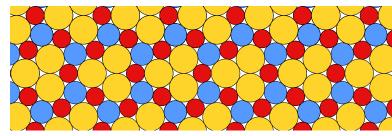
$$\delta(P) := \limsup_{n \to \infty} \frac{\operatorname{area}\left(n \nmid \stackrel{n}{\blacksquare} \cap P\right)}{\operatorname{area}\left(n \nmid \stackrel{n}{\blacksquare}\right)}$$

Definitions

Disks:



Packing P: (in \mathbb{R}^2)



Density:

$$\delta^*\approx 90.9\%$$

Main Question

Given a finite set of disks (e.g., $\bigcirc \bullet \bullet$), what is the maximal density δ^* of a packing?

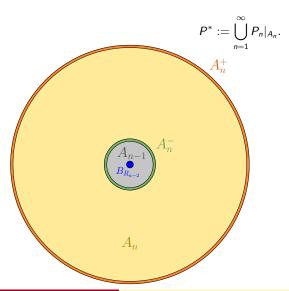
$$\delta^* := \sup_{P} \delta(P)$$

Existence of optimal packing

 $\delta^* = \sup$: does a packing of density δ^* always exist?

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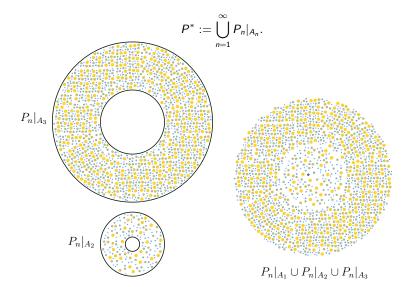
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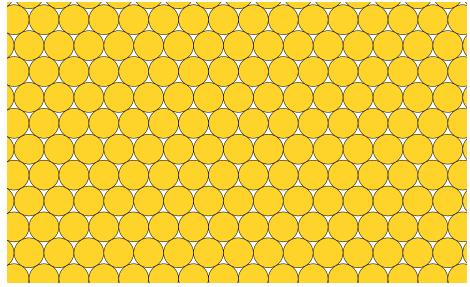


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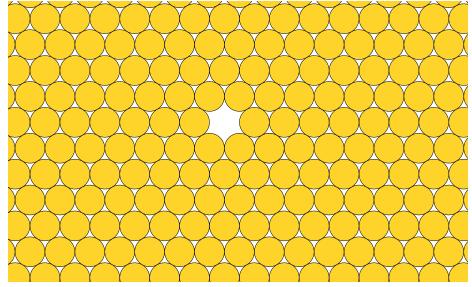
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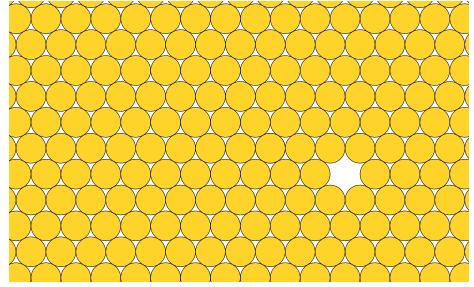
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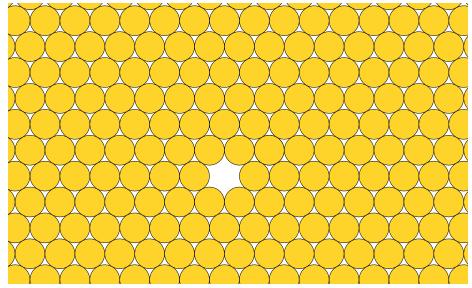
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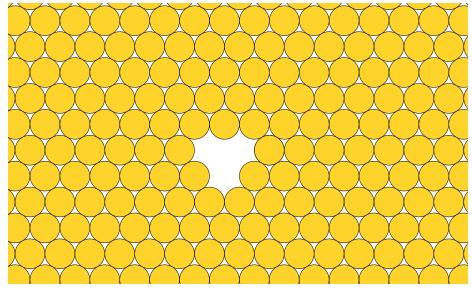
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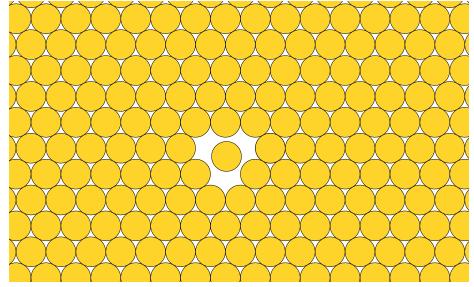
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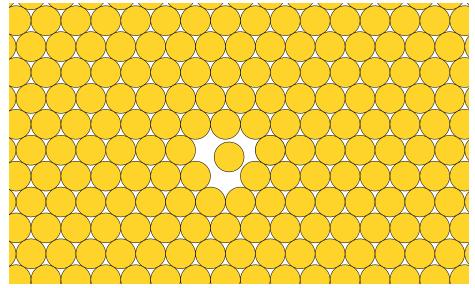
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How many packings of density δ^* ? continuum

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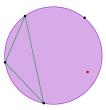
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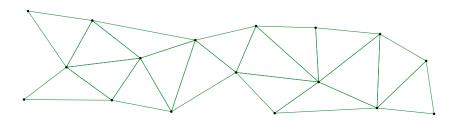
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triangles ABC, ABD satisfy Delaunay condition

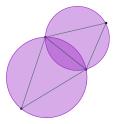
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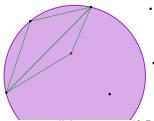
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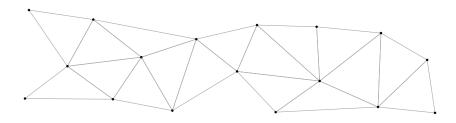
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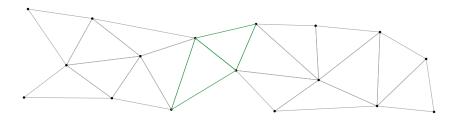
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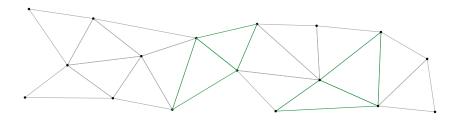
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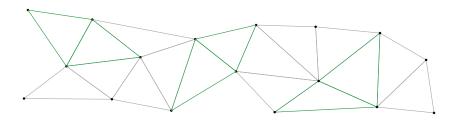
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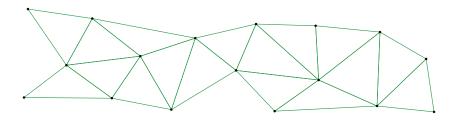
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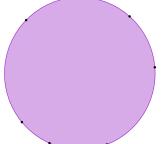
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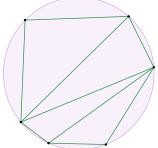
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3 points on the same line \Rightarrow none

Flip Algorithm

all triangulations are connected by flips ${\tt Lawson~1972}$

flipping non-Delaunay edges, we obtain a Delaunay triangulation in at most $\binom{n}{2}$ flips

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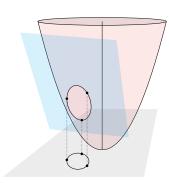
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 $triangulation = polyhedral \ triangulated \ surface$



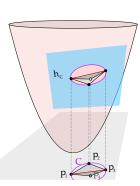
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triangulation = polyhedral triangulated surface

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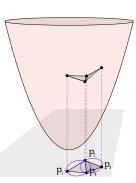
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flip $p_1p_3 \rightarrow p_2p_4$:



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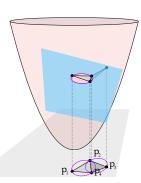
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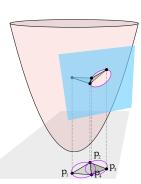
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non-Delaunay edge p_1p_3 : p_4 is inside $p_1p_2p_3$ -circumscircle C, so $L(p_4)$ is under the plane h_C flip $p_1p_3 \to p_2p_4$: $L(p_3)$ is above the plane $L(p_1, p_2, p_4)$

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all triangulations are connected by flips Lawson 1972

flipping non-Delaunay edges, we obtain a Delaunay triangulation in at most $\binom{n}{2}$ flips

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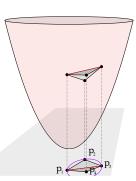
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Delaunay flip: two top faces \rightarrow two bottom faces

⇒ the surface becomes lower (point-wise)



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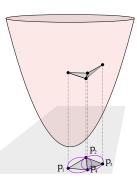
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Delaunay triangulation and Voronoi diagram

Given $S \subset \mathbb{R}^2$ set of points,

Delaunay triangulation and Voronoi diagram

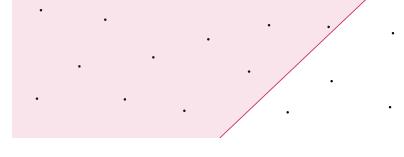
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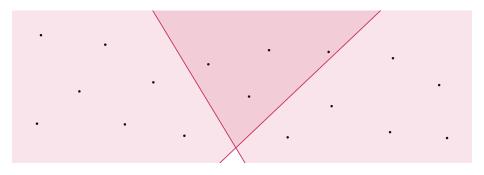
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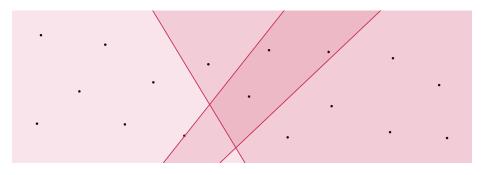
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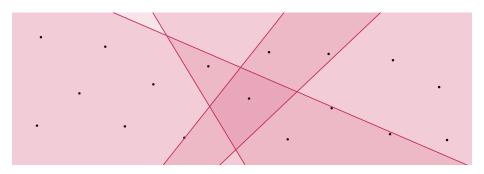
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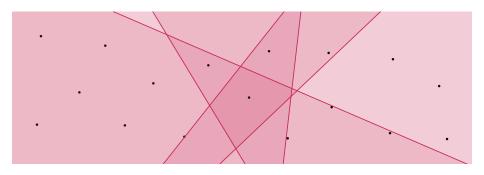
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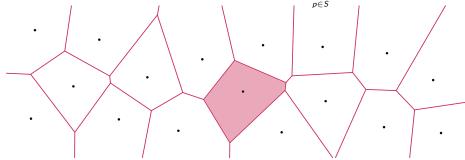


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Voronoi cell is convex polygonal domain (possibly unbounded)

Voronoi diagram of S: union of Voronoi cells of its points $\bigcup Vor(p)$

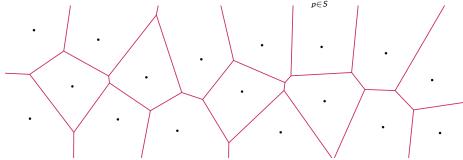


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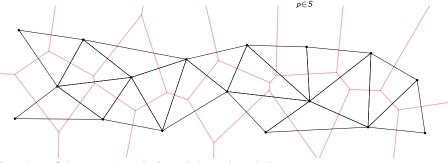


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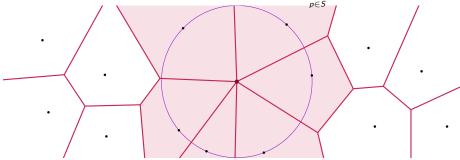
all vertices of degree \leq 3 \Rightarrow dual graph is a triangulation

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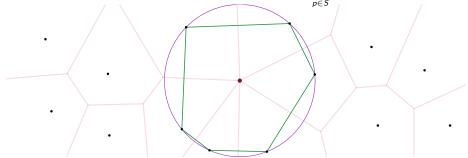
vertex v of the diagram is adjacent to ≥ 3 faces \Rightarrow their points \in circle centered in v s.t. no other point from S inside circle

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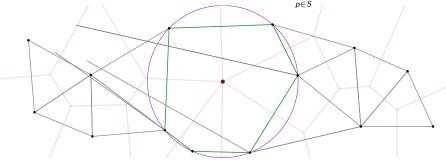
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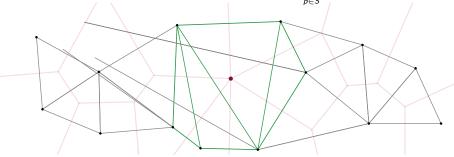
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Properties of Delaunay triangulations

- does not exist if three collinear points
- circumscribed circle of each triangle contains no other points
- edges do not intersect: exercise
- maximizes minimal angle in the triangulation exercise

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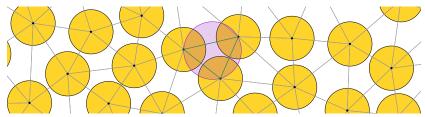
Delaunay triangulation of a disk packing is Delaunay triangulation of disk centers



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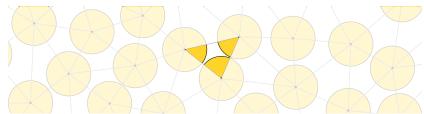


a packing is **saturated** is can not insert more disks without overlap if packing is saturated, circumcircle of each triangle is of radius at most 2

Properties of Delaunay triangulations

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Delaunay triangulation of a disk packing is Delaunay triangulation of disk centers



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Density of a triangle Δ in a packing = its proportion covered by disks

$$\delta_{\Delta} = \frac{\operatorname{area}(\Delta \cap P)}{\operatorname{area}(\Delta)}$$

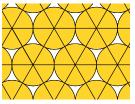


- Introduction
- 2 Definitions
- Mexagonal packing is optimal
- Multi-disk packings
- 6 Homework

Proof with triangles

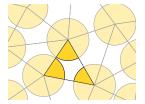


P of density $\delta(P)$

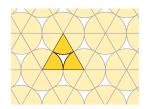


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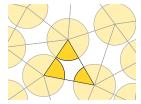


 $P \text{ of density } \delta(P)$ $\forall \Delta, \ \delta(\Delta) \leq \delta() = \delta^*$



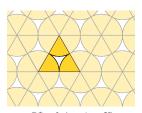
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Proof with triangles



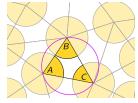
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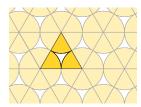


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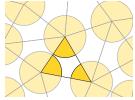
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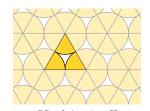
 \bullet the smallest angle of any Δ is at least $\frac{\pi}{6}$

$$2 > R = \frac{|AB|}{2\sin\widehat{C}} \ge \frac{1}{\sin\widehat{C}} \Longrightarrow \widehat{C} > \frac{\pi}{6}$$

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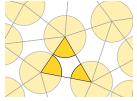
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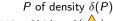
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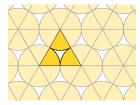
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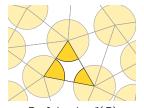
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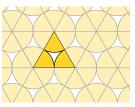
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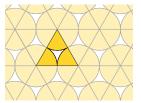
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Proof with triangles



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FM-triangulation

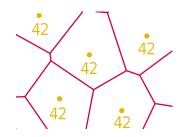
Given a set of points S and weight function $\omega:S o\mathbb{R}^+$,

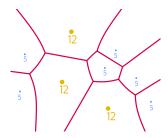
additively weighted Voronoi diagram of S: Voronoi diagram with modified distance

$$d_{\omega}(q,p) := d(q,p) - \omega(p)$$

for $q \in \mathbb{R}^2$ and $p \in S$

the heavier the point the larger its cell $% \left\{ \left(1\right) \right\} =\left\{ \left(1\right) \right\}$





FM-triangulation

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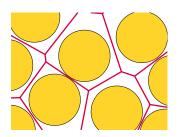
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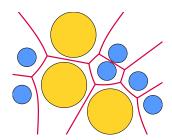
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Let S be the disk centers and $\omega(p)$ equal to the disk radius centered in p





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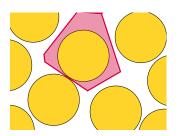
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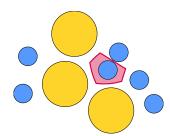
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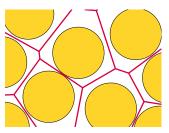
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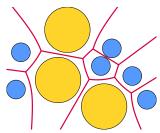
the heavier the point the larger its cell

Let S be the disk centers and $\omega(p)$ equal to the disk radius centered in p

Voronoi cell of a disk in a packing: set of points closer to this disk than to any other

FM-triangulation of a packing: dual graph of the Voronoi diagram Fejes Tóth, Mólnar 1958





FM-triangulation

Given a set of points S and weight function $\omega:S \to \mathbb{R}^+$,

additively weighted Voronoi diagram of S: Voronoi diagram with modified distance

$$d_{\omega}(q,p) := d(q,p) - \omega(p)$$

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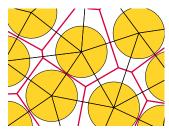
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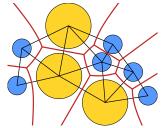
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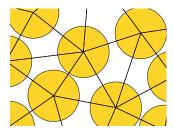
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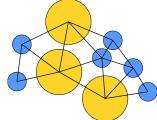
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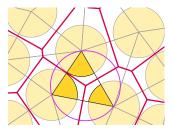
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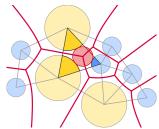
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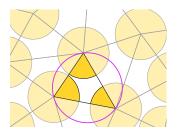
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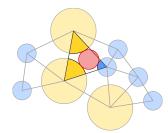
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FM-triangulation of a packing: dual graph of the Voronoi diagram

Fejes Tóth, Mólnar 1958

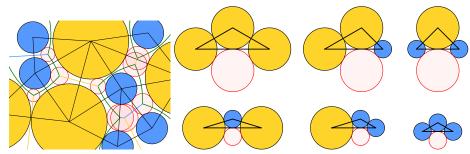




support circle: centered in the Voronoi vertex, tangent to the three disks of FM- Δ if packing is saturated, support circle is of radius at most min radius of disk \in packing

Properties of FM-triangulations

in FM- Δ of a saturated packing, none of its discs can intersect the opposite edge



Uniformity and Florian bound

Packing of uniformity q: packing of the plane by disks of radii $\in [q,1]$.



Uniformity and Florian bound

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Florian, 1960

The density of a packing of uniformity q never exceeds $\bar{\delta}_F(q) := \delta\left(\bigsqcup_{q} q\right)$: $\bar{\delta}_F(q) := \frac{\pi q^2 + 2(1-q^2)\arcsin\left(\frac{q}{1+q}\right)}{2q\sqrt{2q+1}}.$

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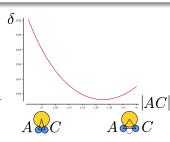
The density of a packing of uniformity q never exceeds $\bar{\delta}_F(q) := \delta\left(\bigsqcup_{q \neq 1} q\right)$: $\bar{\delta}_F(q) := \frac{\pi q^2 + 2(1-q^2)\arcsin\left(\frac{q}{1+q}\right)}{2q\sqrt{2q+1}}.$

Proof:

Among all triangles with 2 contacts



$$\delta(r,x) = \frac{2\left(2\,r^2\arccos\left(\frac{x}{2\,(r+1)}\right) + \arccos\left(\frac{2\,r^2-x^2+4\,r+2}{2\,(r^2+2\,r+1)}\right)\right)}{\sqrt{-x^4+4\,(r^2+2\,r+1)x^2}}$$



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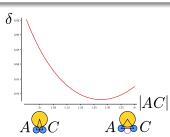
Proof:

Among all triangles with 2 contacts

between disks, \bigwedge_{q} is the densest.



$$\delta(r,x) = \frac{2\left(2\,r^2\arccos\left(\frac{x}{2\,(r+1)}\right) + \arccos\left(\frac{2\,r^2 - x^2 + 4\,r + 2}{2\,(r^2 + 2\,r + 1)}\right)\right)}{\sqrt{-x^4 + 4\,(r^2 + 2\,r + 1)x^2}}$$



 For any triangle, there is a denser triangle with at least two contacts. Reduce the dimension of the set of triangles $(3 \rightarrow 1)$

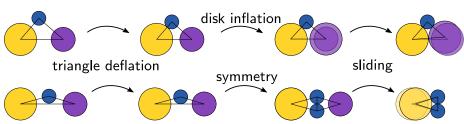
Feies Tóth, Mólnar, 1958

Dimension reduction

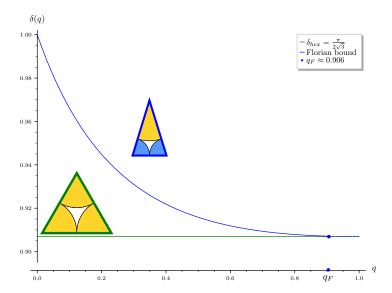
Given uniformity q,

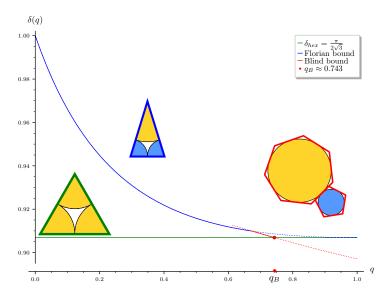
for any FM-triangle, there is a denser FM-triangle with at least two contacts

Proof: each transformation does not diminish the density of the triangle



Florian bound 1960





Power (Laguerre) diagram

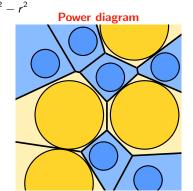
Given a disk D of radius r centered in O in packing P,

Voronoi cell(D): points closer to D than to any other disk in P in Euclidean distance:

$$dist_D(X) = d(O, X) - r$$

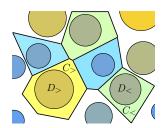
Power cell(D): points closer to D than to any other disk in P in power distance

 $\Pi_D(X) = d(O, X)^2 - r^2$ Voronoi diagram

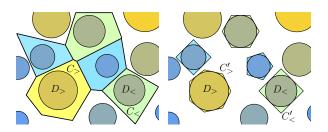


power cells are convex and polygonal (exercise)

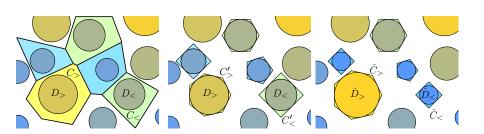
- lacktriangle the mean number of edges of power cells in a packing is ≤ 6
- \bigcirc D disk, C its power cell with k edges



- lacktriangle the mean number of edges of power cells in a packing is ≤ 6
- O disk, C its power cell with k edges
- **3** C' regular circumscribed version of C area(C') < area(C)



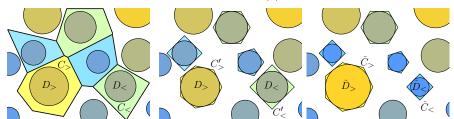
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- $\delta k > 6$: \tilde{C} , \tilde{D} : inflated to get disk of radius 1



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$$q \in [0.612, 0.74]$$
 $\delta(P) \le \delta_B(q) := \frac{\pi(q^2 + 1)}{q^2 a(5) + a(7)}$

$$q > 0.74$$
 $\delta(P) \le \frac{\pi}{\mathsf{a}(6)} = \delta_{\mathsf{hex}}.$



- Introduction
- 2 Definitions
- Hexagonal packing is optimal
- Multi-disk packings
- 6 Homework

4/12-11/12

- Given an FM-triangle with disks of radii r_A , r_B , r_C of a saturated packing of uniformity q, find lower and upper bounds on its edge lengths.
- ② Use interval arithmetic in any programming language supporting it. You know the value of the optimal density of a triangle of uniformity r (Florian bound, slide 14). Find an enclosure e of the length of the rr-edge of a triangle formed by one unit disk and two r-disks, where the unit disk is tangent to both small disks for $r=\frac{2}{\sqrt{3}}-1$, such that $\delta(e)$ contains the optimum (and it is certified). You can use the formula from slide 14.
- Prove that the edges in the Delaunay triangulation do not intersect.
- ** Write an algorithm, that takes $\{(c_i, r_i)\}_{i=1}^n$ where $c_i = (x_i, y_i)$ are disk center coordinates and r_i are disk radii as input and constructs an FM-triangulation of the packing. The output is $\{(i, j)\}_{\text{there is an edge between } c_i \text{ and } c_j}$.

LaTeX-generated pdfs, txt, anything except handwriting to be submitted by email to: daria.pchelina@ens-lyon.fr

Deadline: beginning of the lecture in one week (11/12, 10h15)