

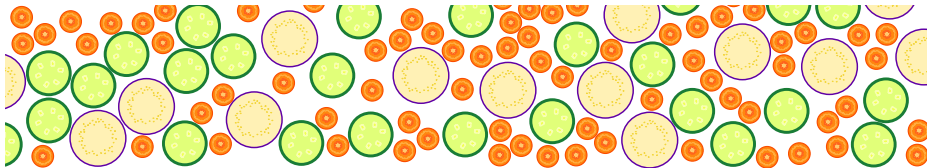
# Triangulated ternary disc packings that maximize the density

**Daria Pchelina**

supervised by

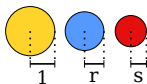
Thomas Fernique

September 29, 2020

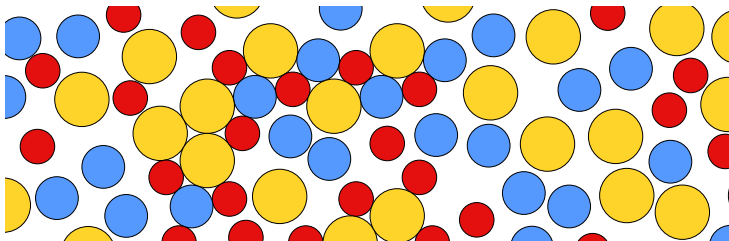


# What is a packing?

Discs:

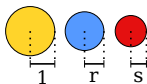


Packing  $P$ :  
(in  $R^2$ )

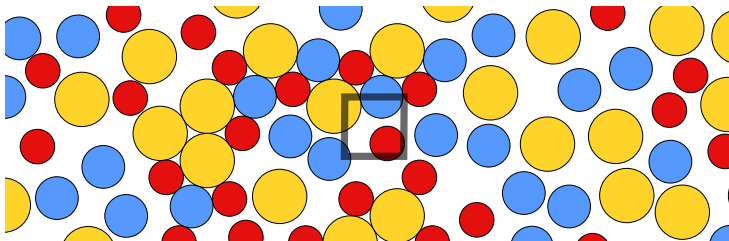


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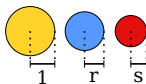


Density:

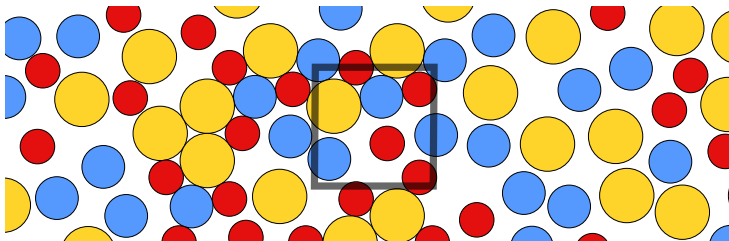
$$\delta(P) = \limsup_{n \rightarrow \infty} \frac{\text{area}([-n, n]^2 \cap P)}{\text{area}([-n, n]^2)}$$

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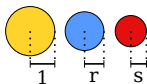


Density:

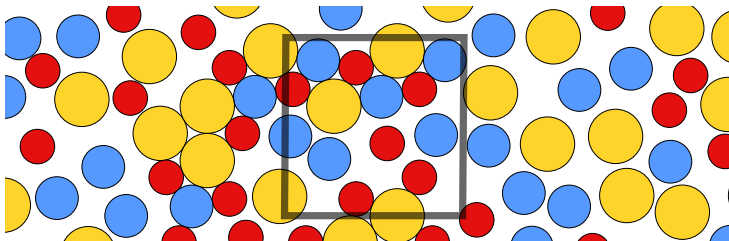
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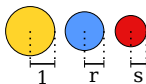


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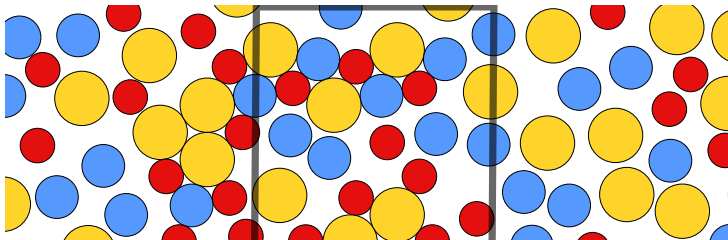
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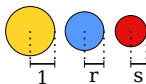


Density:

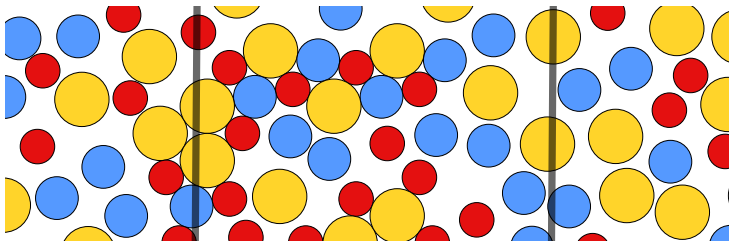
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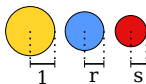


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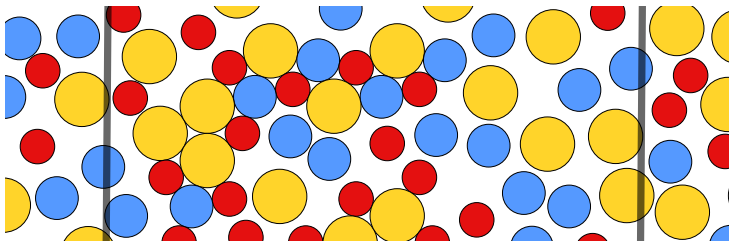
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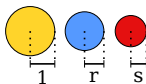
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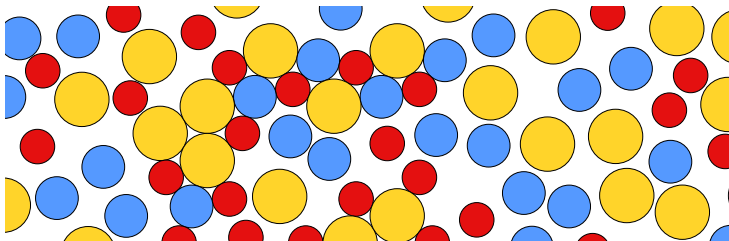


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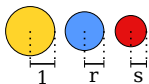
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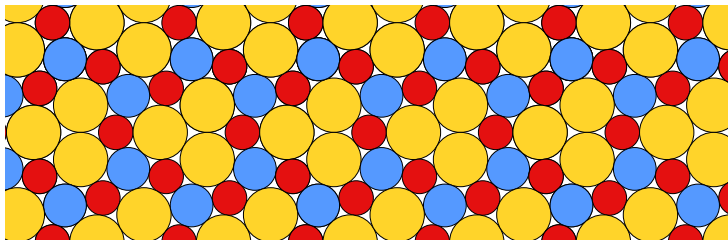
## Which packings maximize the density?

# What is a packing?

Discs:



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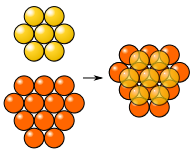
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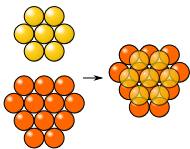
# Why do we study packings?

- To pack fruits

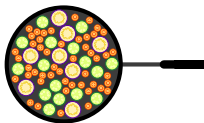


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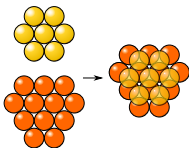


- and vegetables

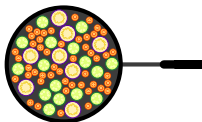


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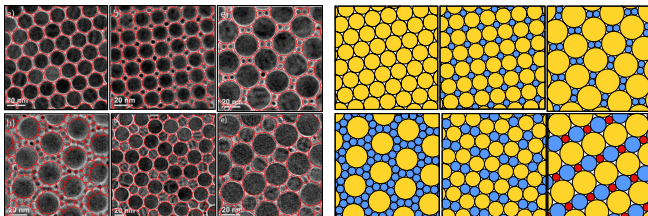
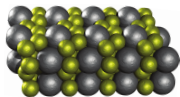
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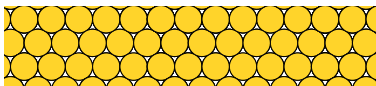


- To make compact materials



Binary and ternary superlattices self-assembled from colloidal nanodisks and nanorods.  
Journal of the American Chemical Society, 137(20):6662–6669, 2015.

2D hexagonal ●-packing:



$$\delta = \frac{\pi}{2\sqrt{3}}$$

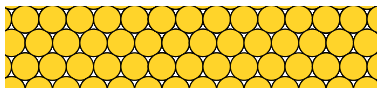
Lagrange, 1772

Hexagonal packing maximize the density among ● lattice packings.

Thue, 1910 (Toth, 1940)


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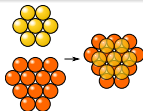
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3D hexagonal  -packing:



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Gauss, 1831

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Hales, Ferguson, 1998–2014

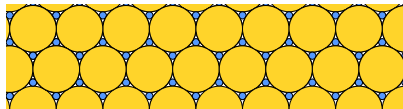
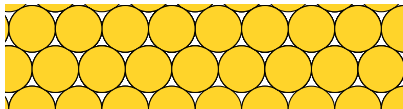
(Conjectured by Kepler, 1611)

Hexagonal packing maximize the density.

Two discs of radii 1 and  $r$ :



**Lower bound** on the density:  $\frac{\pi}{2\sqrt{3}}$  (hexagonal packing with only 1 disc used)

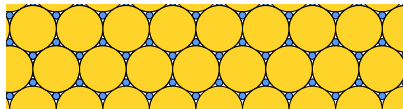
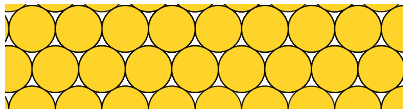




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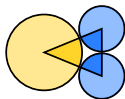
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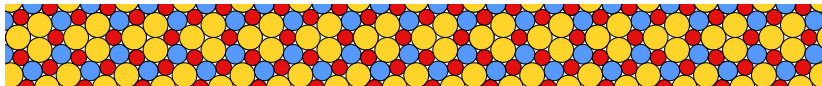
**Upper bound** on the density:

Florian, 1960

The density of a packing never exceeds the density in the following triangle:

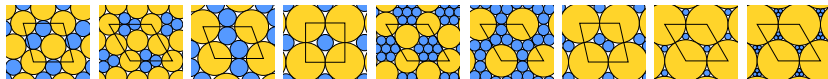


A packing is called **triangulated** if each “hole” is bounded by three tangent discs.

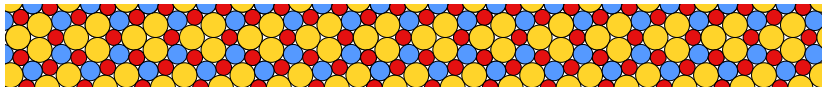


Kennedy, 2006

There are 9 values of  $r$  allowing triangulated packings.

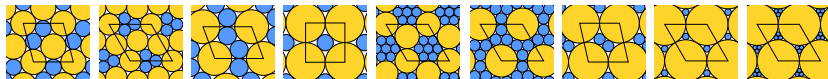


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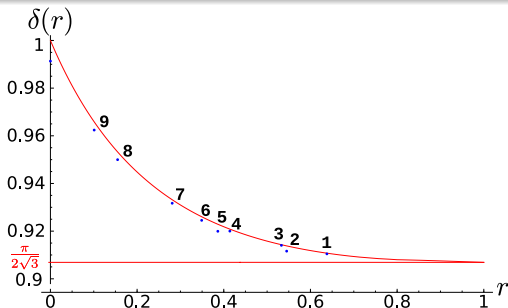


Heppes 2000,2003

Kennedy 2004

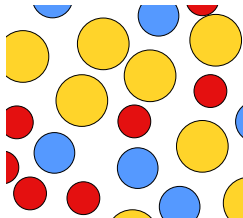
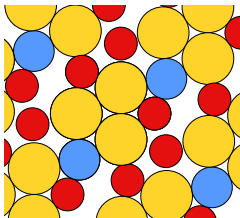
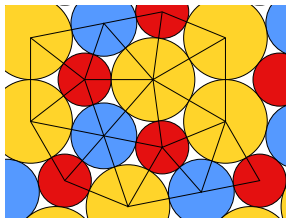
Bedaride, Fernique, 2019:

All these 9 packings  
maximize the density



## Conjecture (Connelly, 2018)

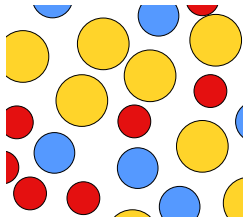
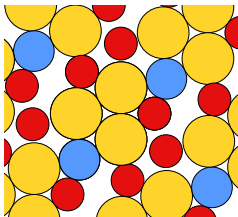
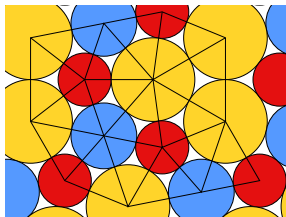
If a finite set of discs allows a **saturated** triangulated packing then the density is maximized on a saturated triangulated packing.



True for ● and ●●.

**Conjecture** (Connelly, 2018)

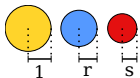
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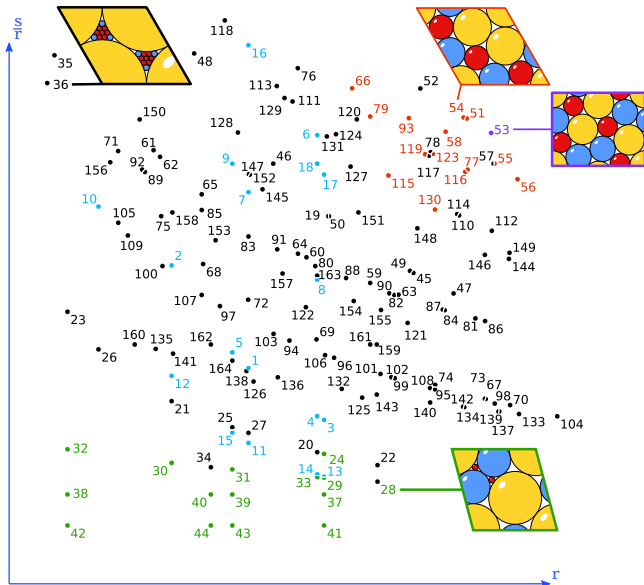
**True** for  and  .

**What happens with**    ?

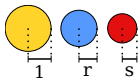
3 discs



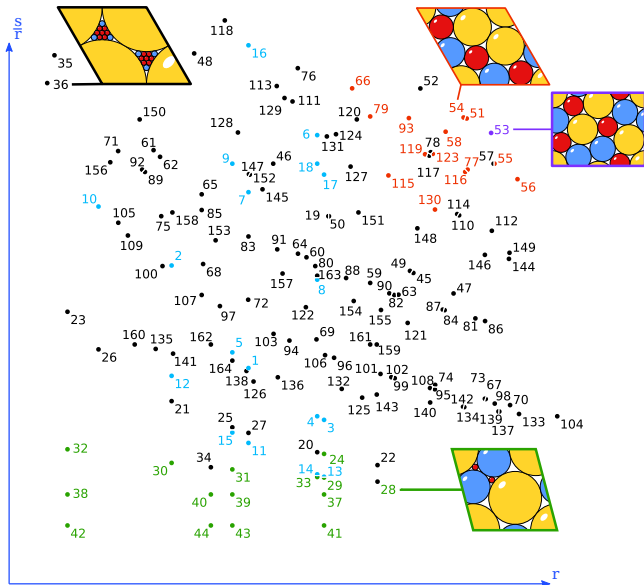
- 164  $(r, s)$  with triangulated packings: (Fernique, Hashemi, Sizova 2019)
- 15 non saturated
- Case 53 is proved (Fernique 2019)
- 14 more cases (the internship)



3 discs

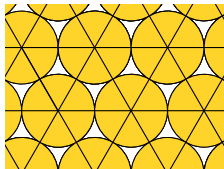


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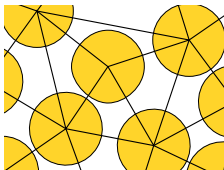


# Idea of the proof for

A **Delaunay triangulation** of a packing: no points inside a circumscribed circle



$$\delta^* = \delta_{\Delta^*} = \frac{\pi}{2\sqrt{3}}$$

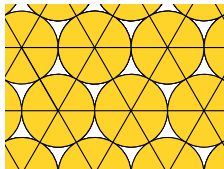


$$\forall \Delta, \delta_{\Delta} \leq \delta_{\Delta^*} = \delta^*$$

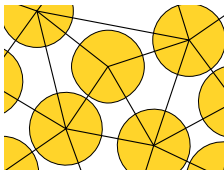


# Idea of the proof for ●

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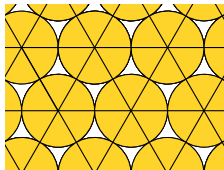
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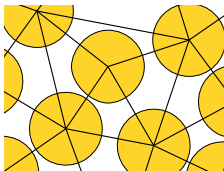
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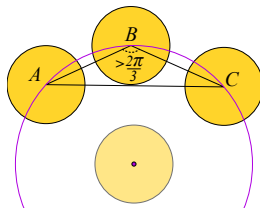
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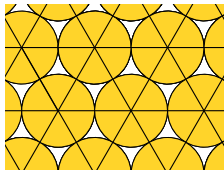


- The largest angle of any  $\Delta$  is between  $\frac{\pi}{3}$  and  $\frac{2\pi}{3}$

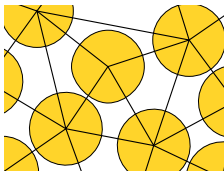
$$R = \frac{|AC|}{2 \sin \hat{B}} \geq \frac{1}{\sin \hat{B}}$$

# Idea of the proof for

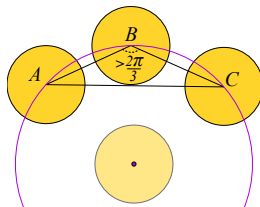
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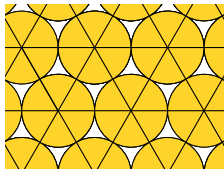
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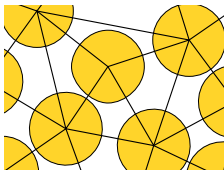
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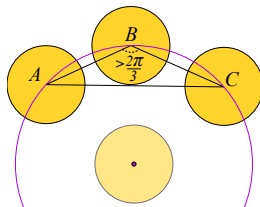
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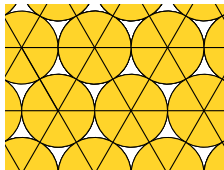
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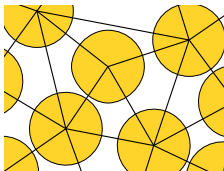
- The area of a triangle  $ABC$  with the largest angle  $\hat{B}$  is  $\frac{1}{2}|AB| \cdot |BC| \cdot \sin \hat{B}$  which is at least  $\frac{1}{2} \cdot 2 \cdot 2 \cdot \frac{\sqrt{3}}{2} = \sqrt{3}$

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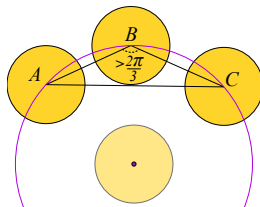
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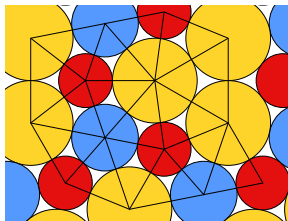
$$R = \frac{|AC|}{2 \sin \hat{B}} \geq \frac{1}{\sin \hat{B}}$$

- The density of a triangle  $\Delta$ :  $\delta_{\Delta} = \frac{\pi/2}{\text{area}(\Delta)}$

- The area of a triangle  $ABC$  with the largest angle  $\hat{B}$  is  $\frac{1}{2}|AB| \cdot |BC| \cdot \sin \hat{B}$  which is at least  $\frac{1}{2} \cdot 2 \cdot 2 \cdot \frac{\sqrt{3}}{2} = \sqrt{3}$

- Thus the density of  $ABC$  is less or equal to  $\frac{\pi/2}{\sqrt{3}}$

Delaunay triangulation  $\rightarrow$  weighted by the disc radii

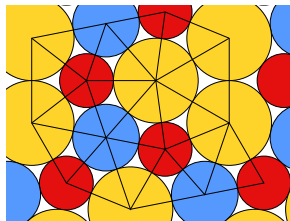


Triangles have different densities:

$$\delta(\text{triangle with 3 yellow circles}) \neq \delta(\text{triangle with 1 blue and 2 red circles})$$

What to do?

Delaunay triangulation  $\rightarrow$  weighted by the disc radii

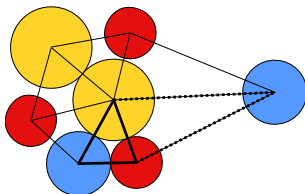


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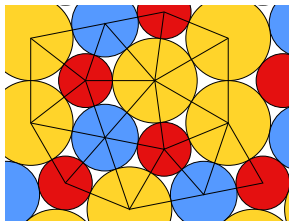
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What to do?

**Redistribution of the densities:**



Delaunay triangulation  $\rightarrow$  weighted by the disc radii

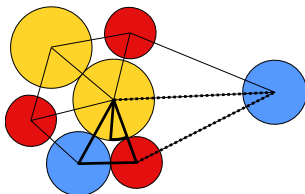


Triangles have different densities:

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What to do?

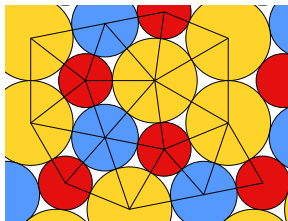
**Redistribution of the densities:**



Some triangles “share their density” with neighbors



Delaunay triangulation  $\rightarrow$  weighted by the disc radii

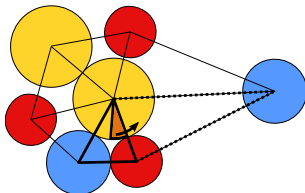


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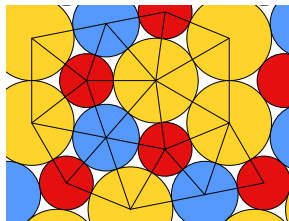
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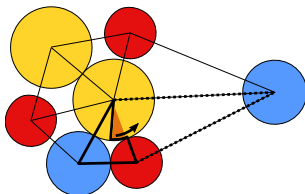


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$\mathcal{T}^*$  – saturated triangulated packing of density  $\delta$

$\mathcal{T}$  – any other saturated packing with the same discs



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The **sparsity** of a triangle  $\Delta \in \mathcal{T}$ :  $S(\Delta) = \delta \times \text{area}(\Delta) - \text{cov}(\Delta)$

$S(\Delta) > 0$  iff the density of covering of  $\Delta$  is less than  $\delta$

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To prove that  $\mathcal{T}$  is no denser than  $\mathcal{T}^*$ , we show that  $\sum_{\mathcal{T}} S(\Delta) \geq 0$

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**1:** Introduce a **potential**  $U$  such that for any triangle  $\Delta \in \mathcal{T}$ ,

$$S(\Delta) \geq U(\Delta) \tag{\Delta}$$

and

$$\sum_{\Delta \in \mathcal{T}} U(\Delta) \geq 0 \tag{U}$$

2: Instead of proving a **global** inequality

$$\sum_{\Delta \in \mathcal{T}} U(\Delta) \geq 0 \quad (U)$$

we define the vertex potential: for a triangle  $\Delta$  with vertices  $A, B$  and  $C$ ,

$$U(\Delta) = \dot{U}_{\Delta}^A + \dot{U}_{\Delta}^B + \dot{U}_{\Delta}^C$$

and prove a **local** inequality for each vertex  $v \in \mathcal{T}$ :

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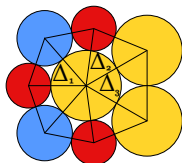
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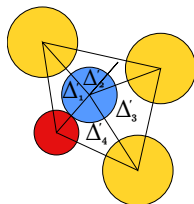
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$$4\dot{U}_{\Delta_1}^v + 2\dot{U}_{\Delta_2}^v + \dot{U}_{\Delta_3}^v = 0$$



$$\dot{U}_{\Delta_1}^{v'} + \dot{U}_{\Delta_2}^{v'} + \dot{U}_{\Delta_3}^{v'} + \dot{U}_{\Delta_4}^{v'} > 0$$

Delaunay triangulation properties  $\rightarrow$  finite number of cases  $\rightarrow$  verification by computer

# Proving an inequality with interval arithmetic

To store and perform computations on transcendental numbers (like  $\pi$ ), we use intervals.

A representation of a number  $x$  is an interval  $I$  whose endpoints are exact values representable in a computer memory and such that  $x \in I$ .

```
sage: x = RIF(0,1) # Interval [0,1]
sage: (x+x).endpoints()
(0.0, 2.0) # [0,1]+[0,1]
sage: x < 2
True #  $\forall t \in [0, 1], t < 2$ 
```



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True #  $\forall t \in [0, 1], t < 2$ 

sage: Ipi = RIF(pi) # Interval for  $\pi$ 
(3.14159265358979, 3.14159265358980)
sage: sin(Ipi).endpoints() # Interval for  $\sin(\pi)$ 
(-3.21624529935328e-16, 1.22464679914736e-16)
sage: sin(Ipi) >= 0
False # Interval for  $\sin(\pi)$  contains 0
```

Defining  $U$ , we try to make it as small as possible keeping it locally positive around any vertex ( $\bullet$ ).

3: How to check

$$S(\Delta) \geq U(\Delta) \quad (\Delta)$$

on each triangle  $\Delta$ ? (There is a continuum of them).

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## Interval arithmetic!

Delaunay triangulation properties  $\rightarrow$  uniform bound on edge length:

Verify  $S(\Delta_{e_1, e_2, e_3}) \geq U(\Delta_{e_1, e_2, e_3})$  where

$$e_1 = [r_a + r_b, r_a + r_b + 2s] \quad e_2 = [r_c + r_b, r_c + r_b + 2s] \quad e_3 = [r_a + r_c, r_a + r_c + 2s]$$

Not precise enough  $\rightarrow$  dichotomy

## What was done and what will be done...

- 14 cases proved      various techniques: computer-assisted proofs, interval arithmetic, optimisation, combinatorics, discrete geometry
- 133 cases to prove (Connelly's conjecture)      for this: good comprehension of the density redistribution, more optimisation
- maximal density for other disc sizes (which do not allow triangulated packings)      deformations of triangulated packings keep the density high → good lower bound on the maximal density