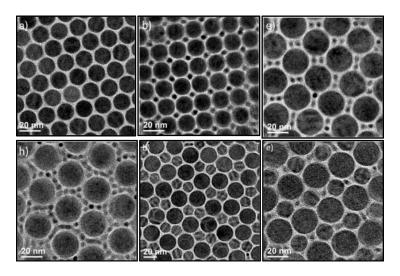
# Maximally Dense Sphere Packings

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### Considered Problem



What is the maximal density of a packing of the Euclidean space by spheres with finitely many prescribed sizes  $r_1, \ldots, r_k$ ?

### Outline

The localization problem

The *m*-localization

Beyond the *m*-localization?

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### One circle

# Theorem (Fejes Tóth, 1943)

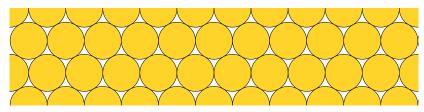
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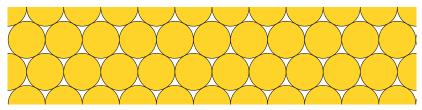


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The maximal density is derived quite locally!

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In a Delaunay triangulation of the centers of a saturated packing by  $^{\circ}$  and  $^{\bigcirc}$ , the densest possible triangle is  $\stackrel{\triangle}{\triangle}$ .

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In a Delaunay triangulation of the centers of a saturated packing by • and •, the densest possible triangle is •.

This yields only an upper bound on the maximal density because  $\triangle$  does not tile the plane:

- and would alternate around •;
- ▶ the angle of the triangle in is larger than  $\frac{\pi}{3}$ ;
- would thus be surrounded by • , but this is impossible.

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#### Weighting rule:

- **P** packing  $\Omega \leadsto$  partition  $\mathcal{P}$  of the space into bounded polytopes;
- each cell has a weight related to the empty volume it contains;
- each cell distributes its weight among nearby spheres.

#### Weighting rule:

- **P** packing  $\Omega \leadsto$  partition  $\mathcal{P}$  of the space into bounded polytopes;
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$$\frac{\kappa|\Omega|}{\operatorname{vol}(\mathcal{P})} \le \frac{\alpha\kappa}{\kappa + \beta}.$$

## Example: one circle

#### Weighting rule:

- ightharpoonup circle packing  $\Omega \leadsto \mathsf{Delaunay}$  triangulation of the plane;
- ▶ the weight of a triangle *R* is equal to  $\frac{\pi}{2\sqrt{3}} \text{vol}(R) \text{cov}(R)$ ;
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#### Upper bound on the density:

$$\delta \leq \frac{\pi}{2\sqrt{3}}$$
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- ▶ the weight of a tetrahedron R is equal to  $\delta_{\rm oct} {\rm vol}(R) {\rm cov}(R)$ , where  $\delta_{\rm oct} \approx 0.720903$  is the density in a regular octahedron;
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Upper bound on the density:

$$\delta \leq \frac{\pi}{3\sqrt{2}} \approx 0.740480$$

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#### Problem 2

Optimal local densities may not exist (aperiodic densest packings?)

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The *m*-localization

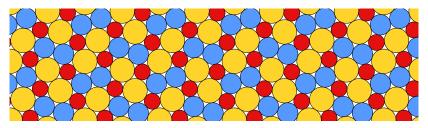
Beyond the *m*-localization

#### The m-localization: teaser

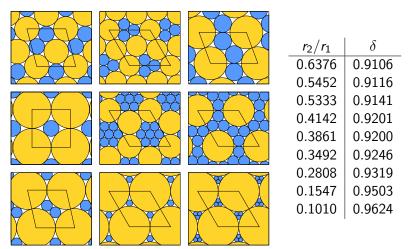
#### This is a weighting rule:

- ▶ introduced under that name by T. Kennedy in 2004;
- relying on ideas introduced by A. Heppes in 2000-02;
- ▶ improved by N. Bédaride and Th. Fernique in 2020.

### Designed to prove maximal density of triangulated packings:



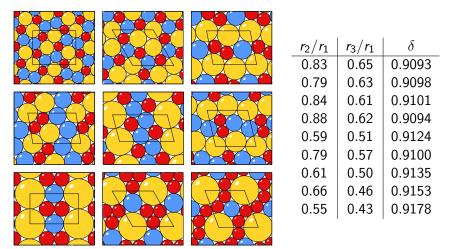
## Triangulated binary packings



Theorem (Kennedy, 2006)

There are exactly 9 sizes allowing a triangulated binary packing.

## Triangulated ternary packings



Theorem (Fernique-Hashemi-Sizova, 2019)

There are exactly 164 sizes allowing a triangulated ternary packing.

Theorem (Heppes 2000-02, Kennedy 2004, Bédaride-F. 2020)

For each of the 9 sizes which allow a triangulated binary packing, the density is maximized by a triangulated binary packing.

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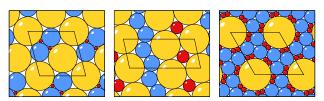
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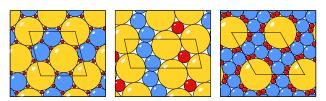
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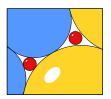
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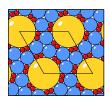
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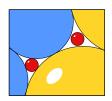


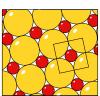


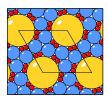
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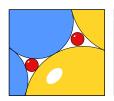




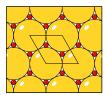
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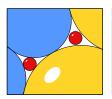


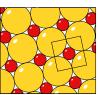


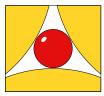
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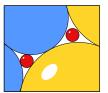


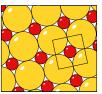


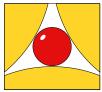
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For 116 sizes, the m-localization does not allow to conclude.

#### The m-localization: definition

#### Weighting rule:

- ▶ packing  $\Omega \rightsquigarrow FM$ -triangulation of the plane;
- ▶ each triangle R has weight at most  $\delta^* vol(R) cov(R)$ ;
- each triangle *cleverly* distributes its weight among its 3 circles.

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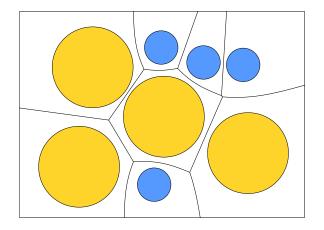
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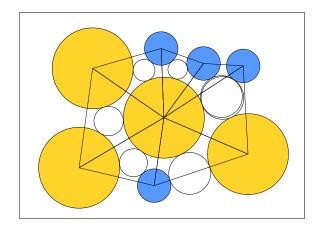
$$\delta \leq \delta^*$$
.

## FM-triangulation

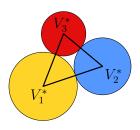


Cell of a circle: the points closer to it than to any other circle.

## FM-triangulation

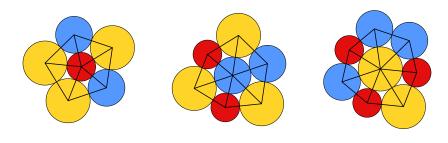


Dual: Fejes-Mólnar (or weighted Delaunay) triangulation.

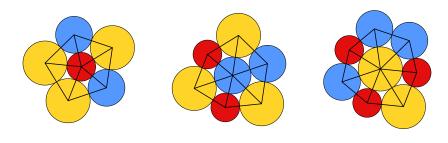


The circles of a tight triangle  $R^*$  receive weights  $V_i^*$ 's which depend only on the 3 circle sizes and satisfy the linear equation:

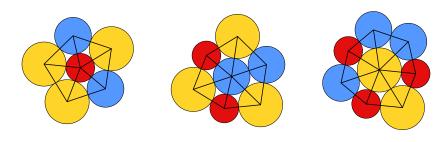
$$V_1^* + V_2^* + V_3^* = \delta^* \text{vol}(R^*) - \text{cov}(R^*).$$



The total weight received by any circle in the (candidate) densest triangulated packing must be nonnegative in order for the local density inequality to be satisfied for this packing.

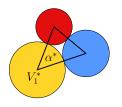


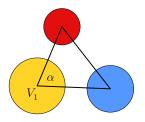
The total weight received by any circle in the (candidate) densest triangulated packing must be equal to 0 in order for the local density inequality to be optimal for this packing.



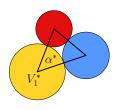
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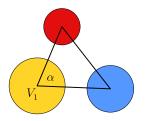
This yields further linear equations on the  $V_i^*$ 's.





Triangle deformation  $\leadsto$  weight deviation:  $V_i := V_i^* + m|\alpha - \alpha^*|$ . m big enough to ensure the local density inequality in any packing. m small enough to have R of weight at most  $\delta^* \mathrm{vol}(R) - \mathrm{cov}(R)$ .





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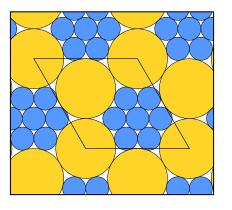
Finitely many configurations Compact set of FM-triangles \rightarrow computer check!

### Outline

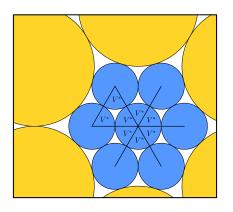
The localization problem

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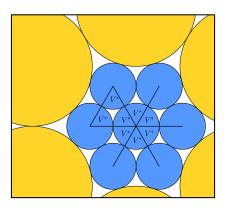
Beyond the m-localization?



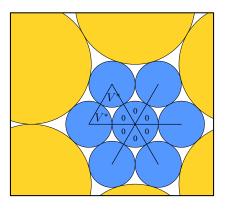
Consider the m-localization for this triangulated binary packing.



Each blue triangle gives weight  $V^*$  to each of its 3 circles. The total weight received by the central blue circle is  $6V^*$ . Hence  $V^*=0$  and the total weight of a blue triangle R is 0.



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Solution: the weight received by a circle depends on its neighbors.

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### Example (Fernique, 2020)

Characterization of the densest packings by circles of size 1 and  $\sqrt{2}-1$  for each possible stoichiometry.

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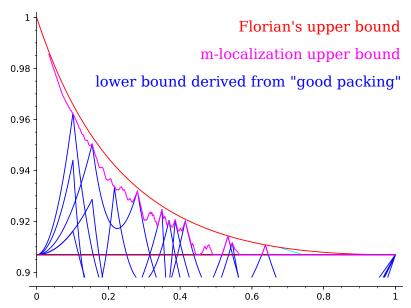
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At least we can hope to get an upper bound on the density. . .

## Upper bounds for binary packings



# Example: two circles within ratio 0.48

