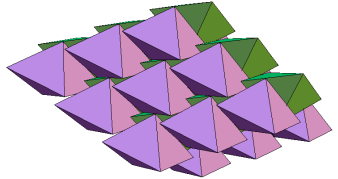
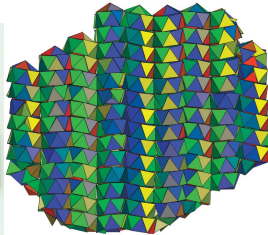


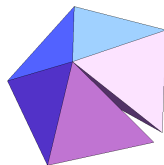
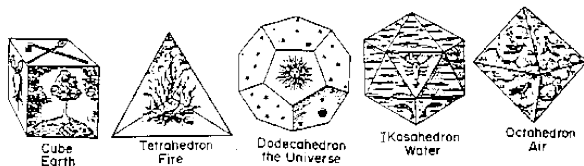
# Packing problems: complex structure from simple interactions



Yoav Kallus  
Santa Fe Institute  
February, 2017



# The long history of packing problems

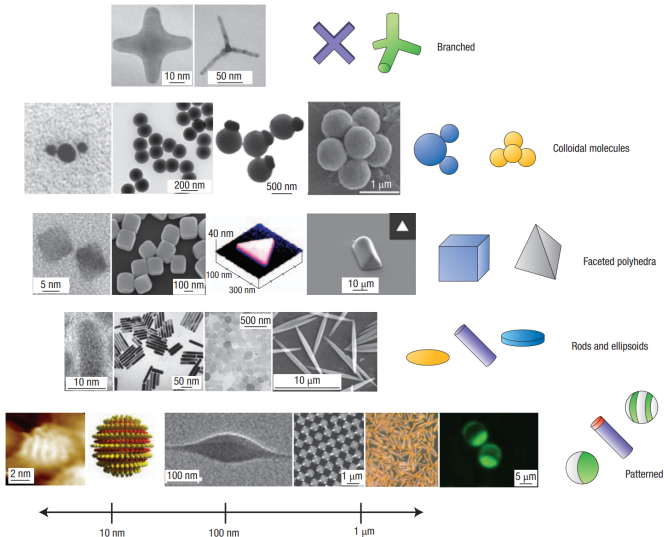


“In general, the attempt to give a shape to each of the simple bodies is unsound, for the reason, first, that they will not succeed in filling the whole. It is agreed that there are only three plane figures which can fill a space, the triangle, the square, and the hexagon, and only two solids, the pyramid [tetrahedron] and the cube.”

– Aristotle. *On the Heavens*, volume III

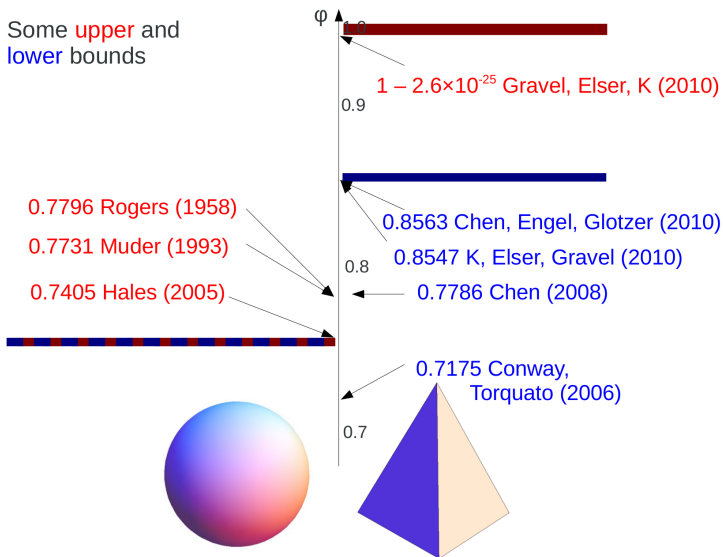


# Building blocks by design

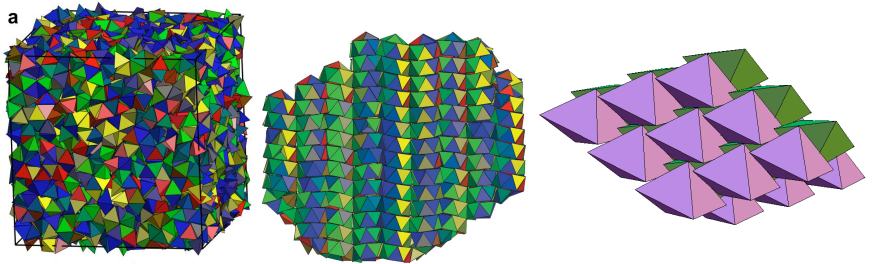


*Glotzer and Solomon, Nature Materials 2007*

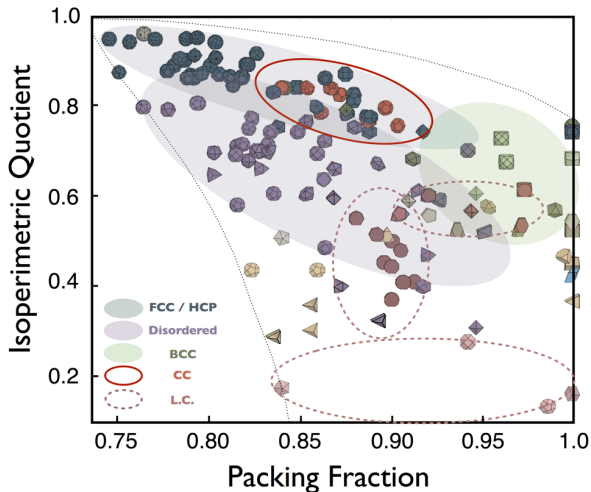
# Packing spheres vs. tetrahedra



# Emergent structure in tetrahedron packing



# Packing convex shapes



Ulam's conjecture: balls are worst among convex shapes

# Worst packing shapes

Best packing shapes are trivial



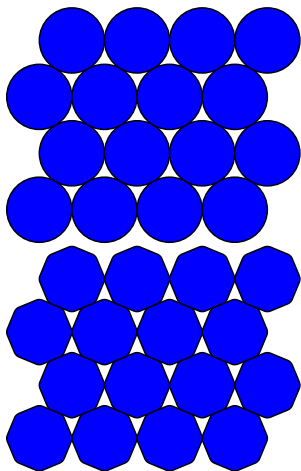
# Worst packing shapes

Best packing shapes are trivial



Worst shape is a more interesting question

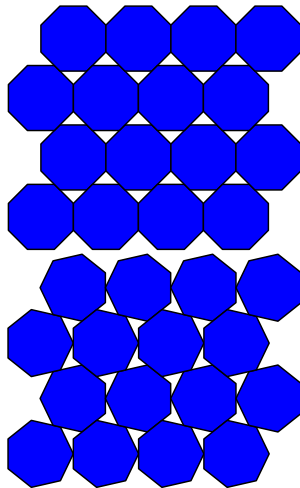
# In 2D disks are not worst



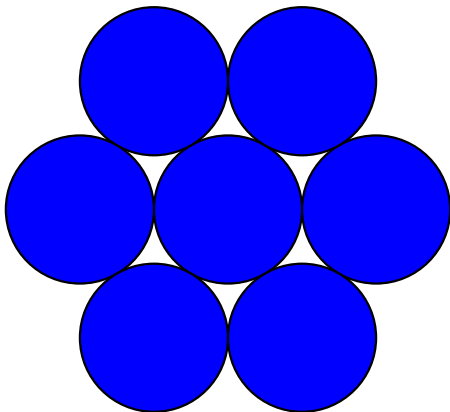
$$\phi = 0.9069 \quad \phi = 0.9062$$

$$\phi = 0.9024$$

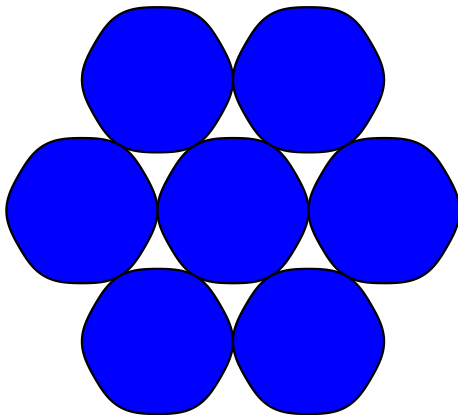
$$\phi = 0.8926(?)$$



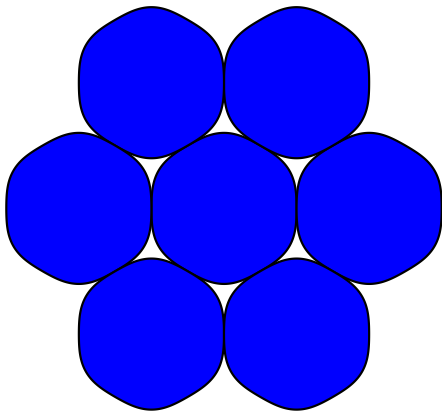
# Why can we improve over circles?



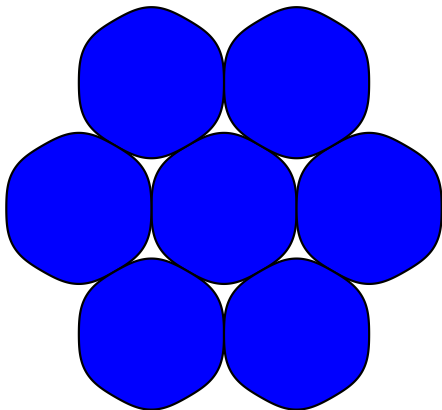
# Why can we improve over circles?



# Why can we improve over circles?



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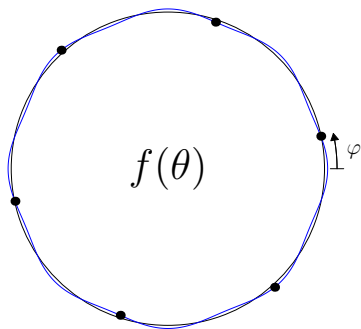
To first order:

$\Delta(\text{vol. per particle}) \propto \text{avg. deformation in contact dirs.}$

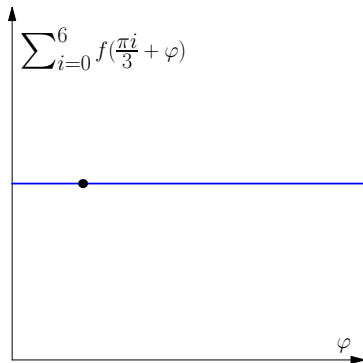
$\Delta(\text{vol. of particle}) \propto \text{avg. deformation in all dirs.}$

Can only break even, and make up in higher orders

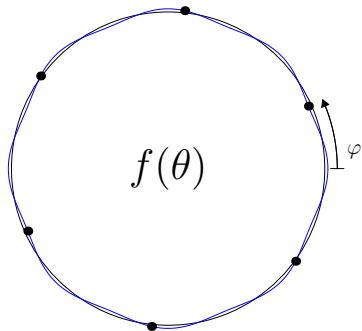
# Why can we improve over circles?



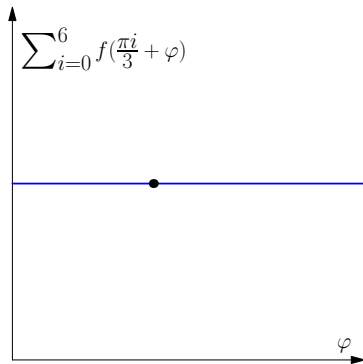
$$f(\theta) = 1 + \epsilon \cos(8\theta)$$



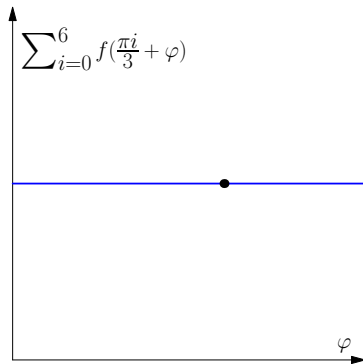
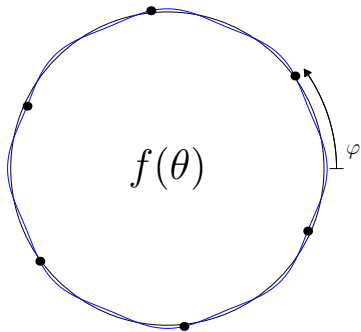
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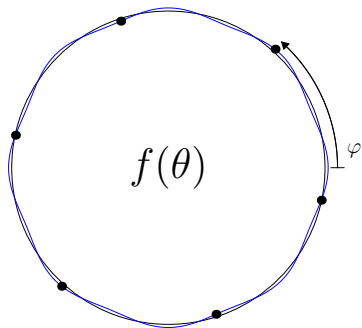


# Why can we improve over circles?

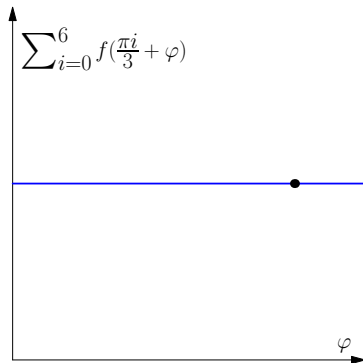


$$f(\theta) = 1 + \epsilon \cos(8\theta)$$

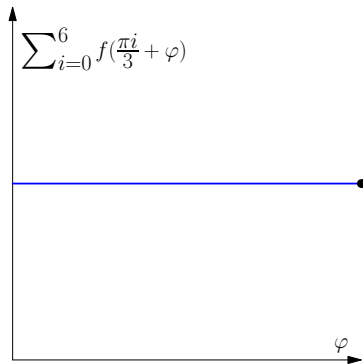
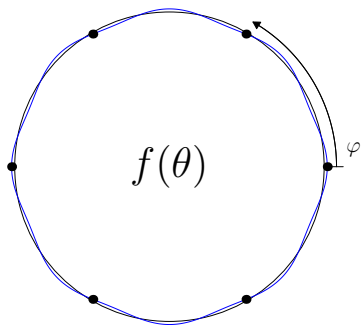
# Why can we improve over circles?



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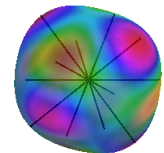
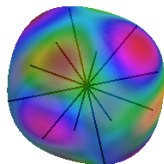
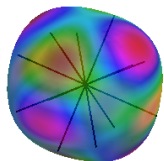
# Why can we improve over circles?



$$f(\theta) = 1 + \epsilon \cos(8\theta)$$

# Why can we not improve over spheres?

Let  $\mathbf{x}_i$ ,  $i = 1, \dots, 12$ , be the twelve contact points on the sphere in the f.c.c. packing.



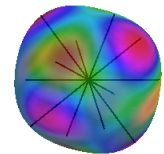
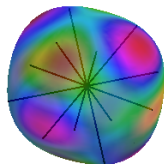
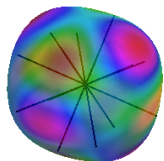
## Lemma

*Let  $f$  be an even function  $S^2 \rightarrow \mathbb{R}$ .*

*$\sum_{i=1}^{12} f(R\mathbf{x}_i)$  is independent of  $R \in SO(3)$  if and only if the expansion of  $f(\mathbf{x})$  in spherical harmonics terminates at  $l = 2$ .*

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## Lemma

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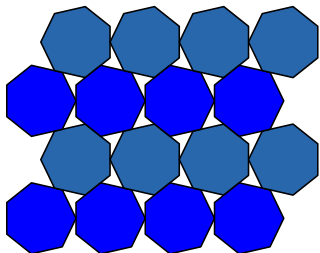
$\sum_{i=1}^{12} f(R\mathbf{x}_i)$  is independent of  $R \in SO(3)$  if and only if the expansion of  $f(\mathbf{x})$  in spherical harmonics terminates at  $l = 2$ .

## Theorem (K)

The sphere is a local minimum of  $\phi$ , the packing density, among convex, centrally symmetric bodies.

*K, Adv Math 2014*

# Heptagons are locally worst packing (?)



0.8926(?)

## Theorem (K)

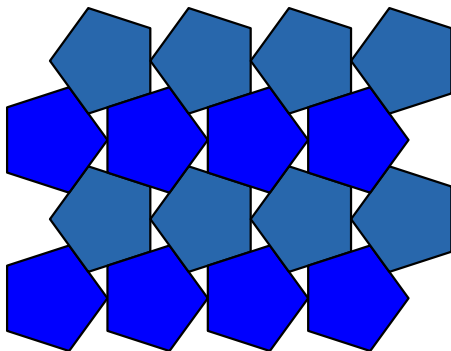
*Any convex body sufficiently close to the regular heptagon can be packed at a filling fraction at least that of the “double lattice” packing of regular heptagons.*

It is not proven, but highly likely, that the “double lattice” packing is the densest packing of regular heptagons.

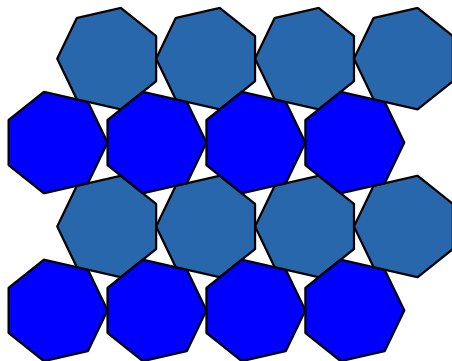
# Local optimality of the double lattice



Work with Wöden Kusner (TU Graz)

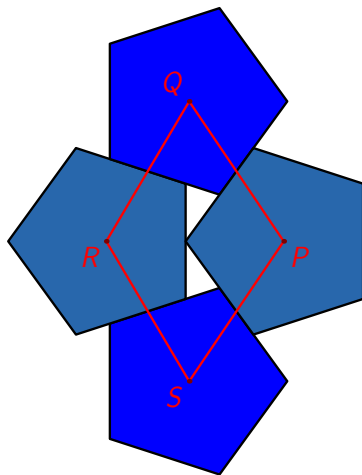
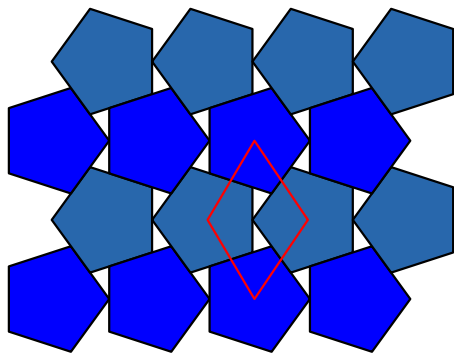


$$\phi = 0.9213$$



$$\phi = 0.8926$$

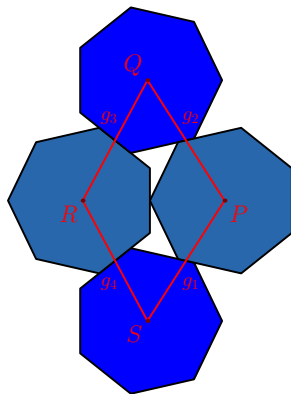
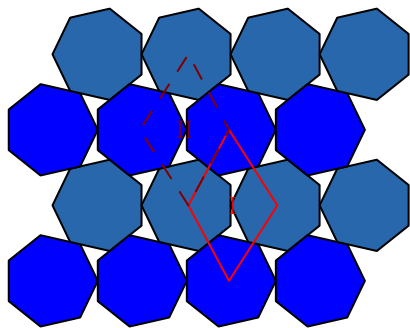
# Pentagons



This configuration is a local minimum among nonoverlapping configurations of  $\text{area}(SPQR)$ .

*K and Kusner, Discrete Comput. Geom. 2016*

# Heptagons

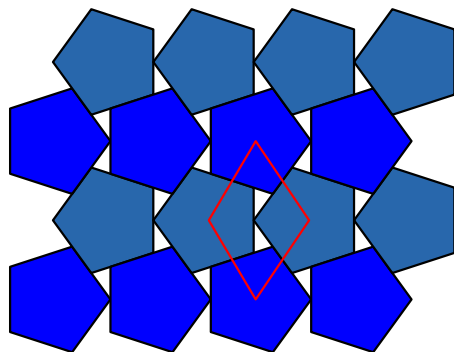


This is not a local minimum of  $\text{area}(SPQR)$ .

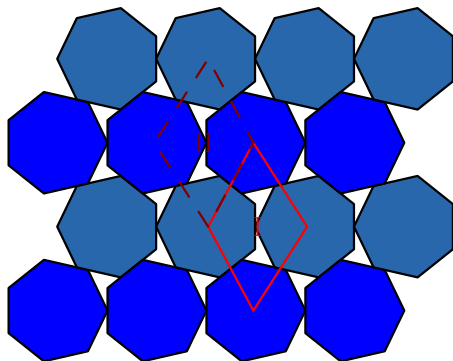
But it is a local minimum of  $\text{area}(SPQR) + \sum_{i=1}^4 g_i$ ,  
 where  $g_i$  are such that, e.g.,  $g_3^{(I)} + g_3^{(II)} = 0$ .

*K and Kusner, Discrete Comput. Geom. 2016*

# Local optimality of the double lattice



$$\phi = 0.9213$$



$$\phi = 0.8926$$

The same method works for (almost) any convex polygon and shows the “double lattice” construction gives locally optimal packings.

*K and Kusner, Discrete Comput. Geom. 2016*