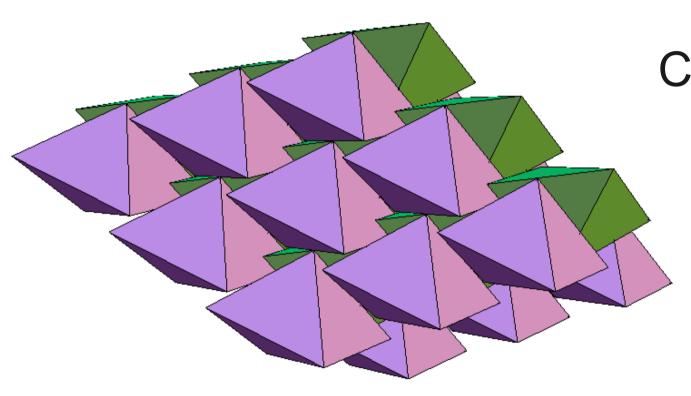
# The Divide and Concur approach to packing



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Shanks Conference Vanderbilt University

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#### Packing problems:

Optimization: given a collection of figures, arrange them without overlaps as densely as possible.

Feasibility: find an arrangement of density > φ

#### Possible computational approaches:

- Complete algorithm
- Specialized incomplete (heuristic) algorithm
- General purpose incomplete algorithm

e.g.: simulated annealing, genetic algorithms, etc.

Divide and Concur belongs to the last category

# Two constraint feasibility

$$x \in A \cap B$$

#### Example:

A = permutations of "ailmopt"

B = 7-letter English words

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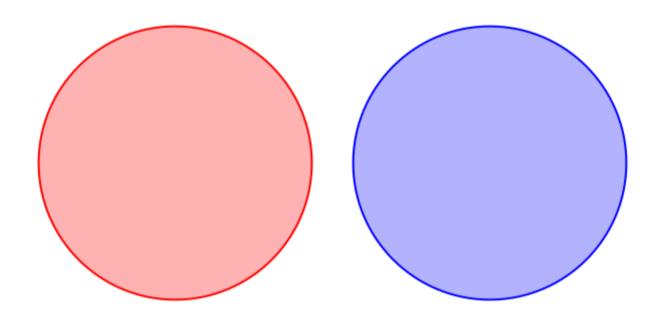
$$x = "optimal"$$

#### More structure

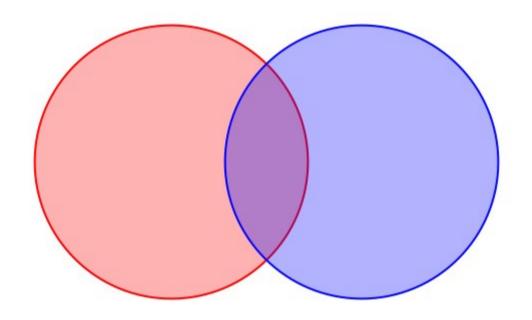
A, B are sets in a Euclidean configuration space  $\Omega$  simple constraints: easy, efficient **projections** to A, B

$$P_A(x) = y \in A$$
 s.t.  $||x-y||$  is minimized

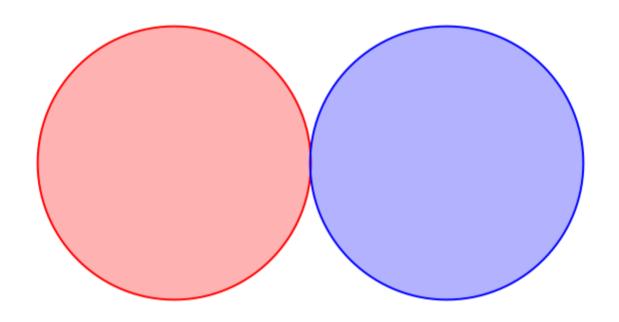
# Projection to the packing (no overlaps) constraint



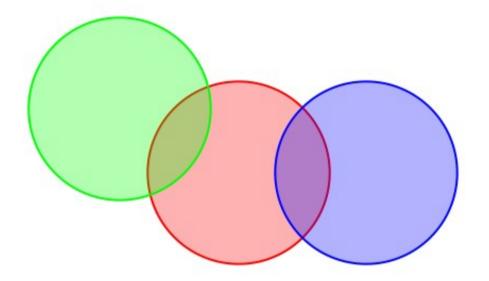
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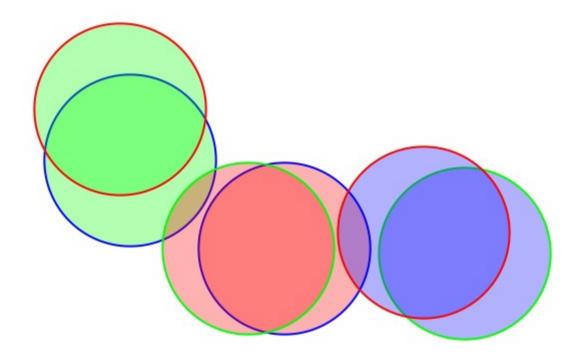
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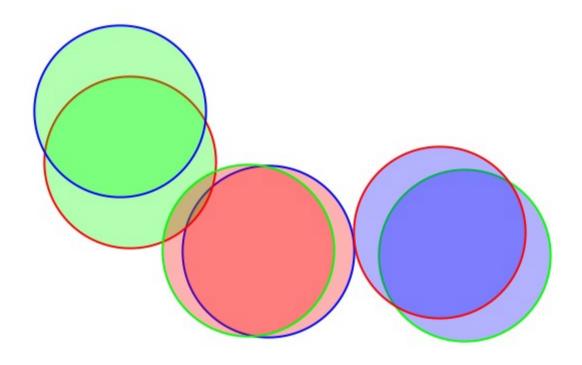
# Dividing the Constraints



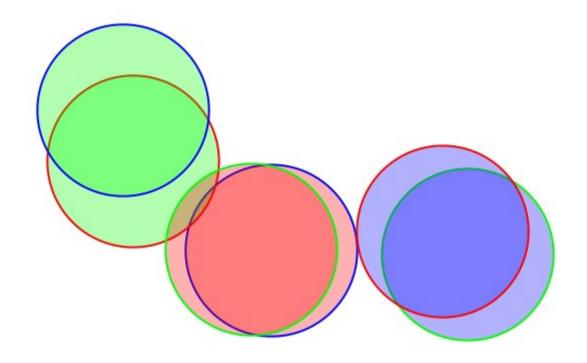
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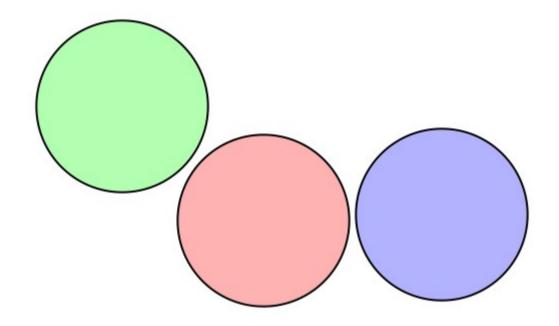
# Dividing the Constraints



# Projection to concurrence constraint



# Projection to concurrence constraint



#### Divide and Concur scheme

\_\_\_\_A\_\_\_\_\_B\_\_\_\_

No overlaps between designated replicas

All replicas of a particular figure concur

"divided" packing constraints

"concurrence" constraint

#### What can we do with projections?

alternating projections:

$$x'_{i} = P_{A}(x_{i}); \quad x_{i+1} = P_{B}(x'_{i})$$

Douglas-Rachford iteration (a/k/a difference map):

$$x_{i+1} = x_i + P_B(2P_A(x_i) - x_i) - P_A(x_i)$$

## Brief (incomplete) history of

$$x_{i+1} = x_i + P_B(2P_A(x_i) - x_i) - P_A(x_i)$$

J. Douglas and H. H. Rachford, *On the numerical solution of heat conduction problems in two or three space variables*, Trans. Am. Math. Soc. 82 (1956), 421–439. splitting scheme for numerical PDE solutions

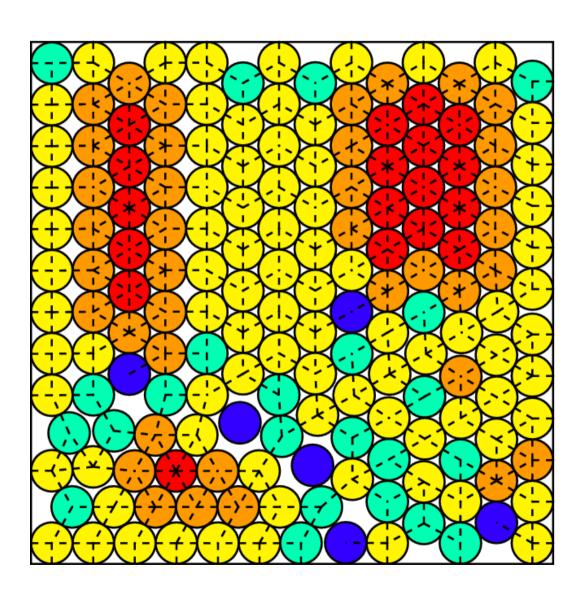
J.R. Fienup, Phase retrieval algorithms: a comparison, Applied Optics 21 (1982), 2758-2769.

rediscovery, control theory motivation, phase retrieval

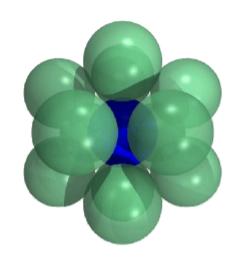
V. Elser, I. Rankenburg, and P. Thibault, Searching with iterated maps, PNAS 104, (2007), 418-423.

generalized form, applied to hard/frustrated problems: spin glass, SAT, protein folding, Latin squares, etc.

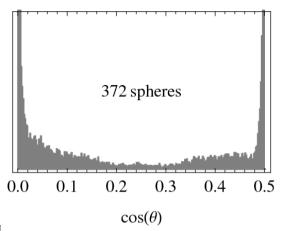
# Finite packing problems

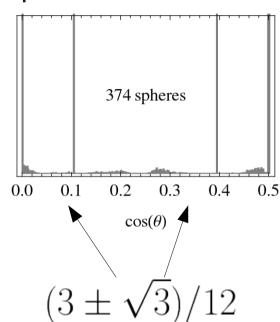


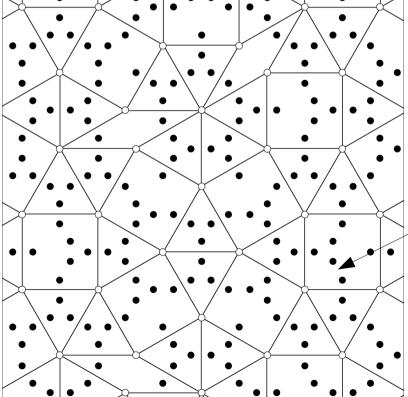
## Finite packing problems



#### The kissing number problem in 10D

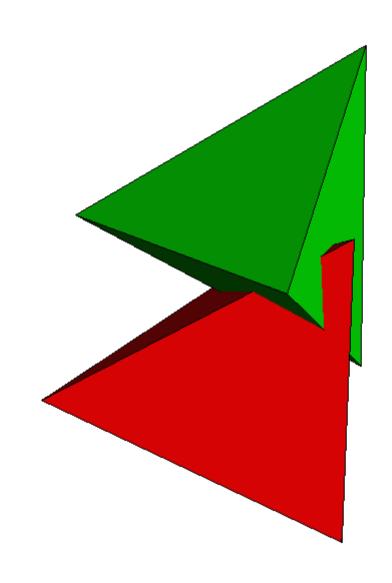


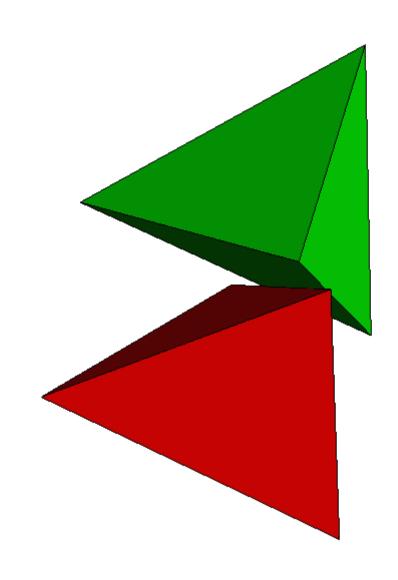




$$A_2 \oplus A_2 \oplus D_4$$

Elser & Gravel, Disc. Compu. Geom. (2010)



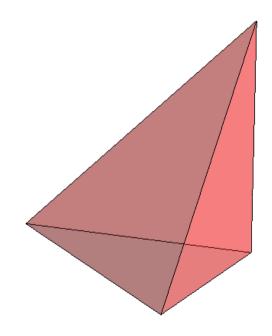


A

"divided" packing constraints (rigidity relaxed)

В

"concurrence" + rigidity constraints

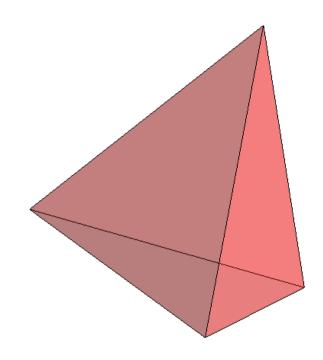


\_\_\_\_A

"divided" packing constraints (rigidity relaxed)

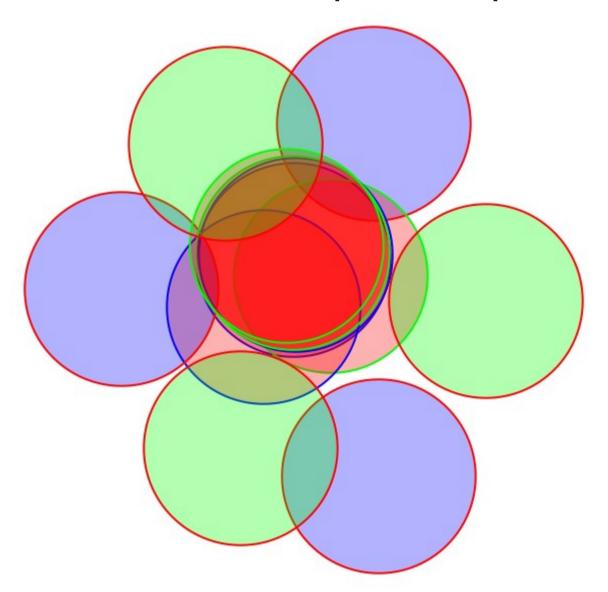
В

"concurrence" + rigidity constraints



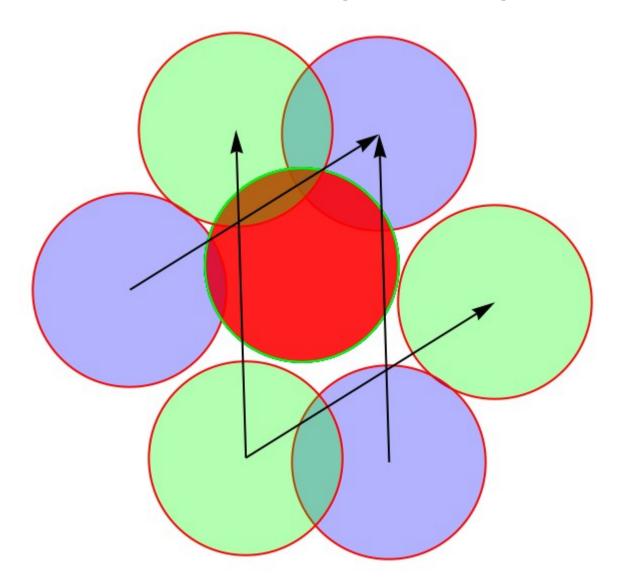
# Generalization to periodic packings

replicas -- replicas + periodic images



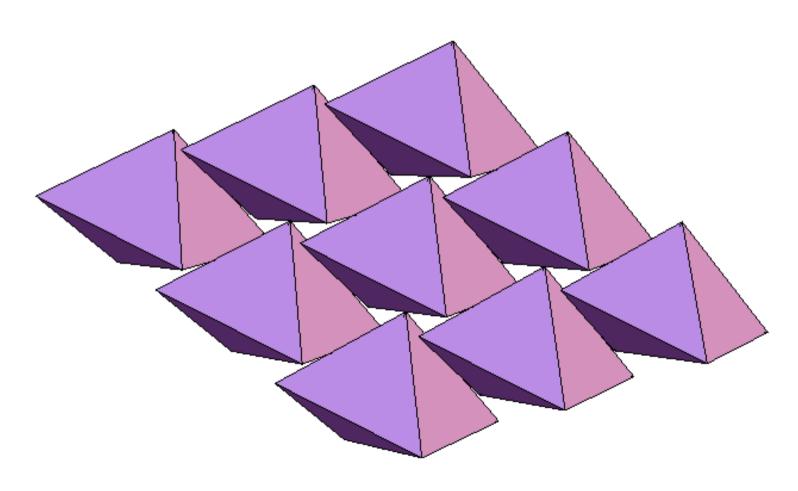
## Generalization to periodic packings

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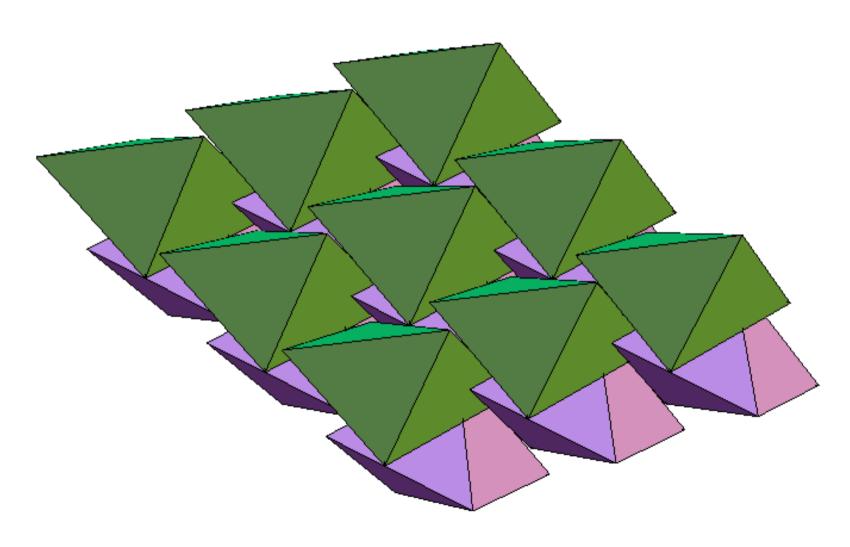
## Regular tetrahedron packing

(Stay tuned for next talk)



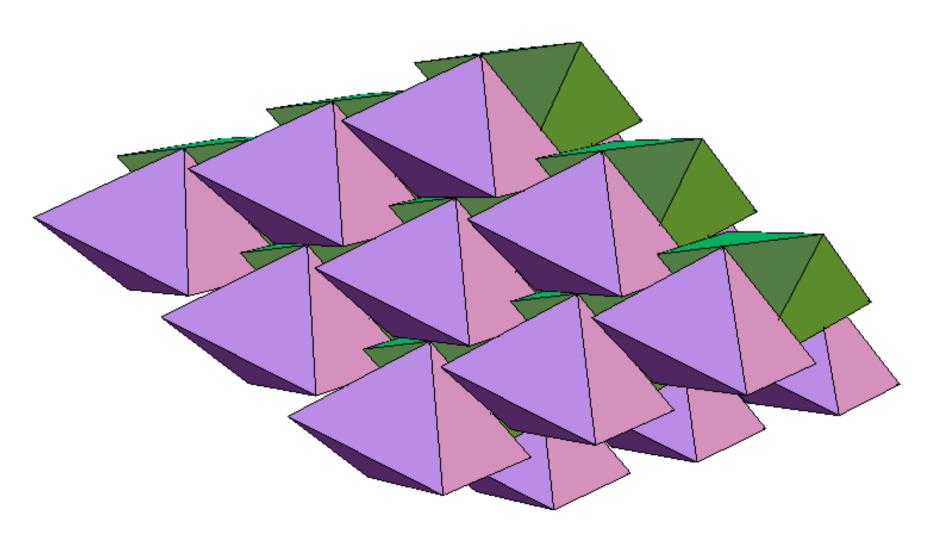
Kallus, Elser, & Gravel, Disc. Compu. Geom. (2010)

# Regular tetrahedron packing



Kallus, Elser, & Gravel, Disc. Compu. Geom. (2010)

# Regular tetrahedron packing



Kallus, Elser, & Gravel, Disc. Compu. Geom. (2010)

#### Double-Lattice Packings of Convex Bodies in the Plane

G. Kuperberg<sup>1</sup> and W. Kuperberg<sup>2</sup> Disc. Compu. Geom. (1990)

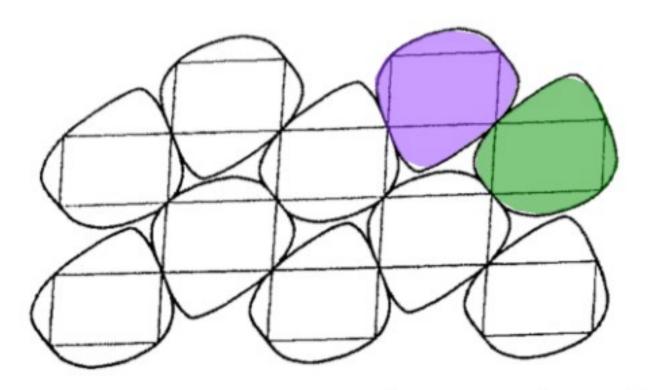
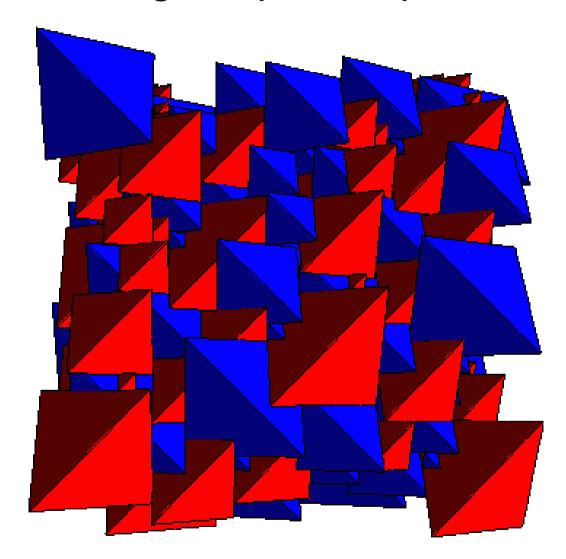


Fig. 4. Double-lattice packing generated by an extensive parallelogram.

Department of Mathematics, University of California at Berkeley, Berkeley, CA 94720, USA

<sup>&</sup>lt;sup>2</sup> Division of Mathematics, Auburn University, Auburn, AL 36849, USA

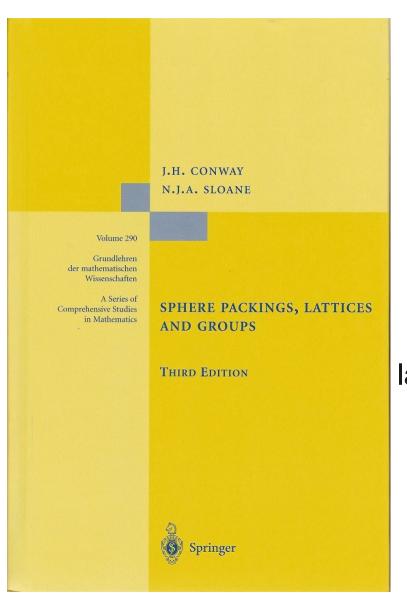
## Regular pentatopes!



$$\varphi = 128/219 = 0.5845$$

Kallus, Elser, & Gravel, arXiv: 1003.3301 (2010)

## Sphere packing and kissing in higher dimensions



Densest known lattice packing in *d* dimensions:

d	$\Lambda_{\mathrm{densest}}$	$\phi_{\mathrm{densest}}^{(L)}$	$\langle N_{\rm iter} \rangle$
2	$A_2$	0.90690	42
3	$D_3$	0.74047	230
4	$D_4$	0.61685	191
5	$D_5$	0.46526	308
6	$E_6$	0.37295	173
7	$E_7$	0.29530	217
8	$E_8$	0.25367	99
9	$\Lambda_9$	0.14577	161
10	$\Lambda_{10}$	0.092021	394
11	$K_{11}$	0.060432	421
12	$K_{12}$	0.049454	397
13	$K_{13}$	0.029208	577
14	$\Lambda_{14}$	0.021624	1652

lattice with highest known kissing number in *d* dimensions:

d	$\Lambda_{ m highest}$	$\tau_{ ext{highest}}^{(L)}$	$\langle N_{\mathrm{iter}} \rangle$
2	$A_2$	6	27
3	$D_3$	12	54
4	$D_4$	24	132
5	$D_5$	40	163
6	$E_6$	72	225
7	$E_7$	126	597
8	$E_8$	240	511
9	$\Lambda_9$	272	350
10	$\Lambda_{10}$	336	438
11	$\Lambda_{11}$	438	549

Kallus, Elser, & Gravel, arXiv: 1003.3301 (2010)

## Tetrahedron packing upper bound

#### Optimization challenge:

- 1. Prove  $\phi \le 1 \epsilon$ , where  $\epsilon > 0$
- 2. Maximize ε

## Tetrahedron packing upper bound

## Optimization challenge:

- 1. Prove  $\phi \le 1 \varepsilon$ , where  $\varepsilon > 0$
- 2. Maximize ε
- 2'. Minimize length of proof

Solution:  $\varepsilon = 5.01... \times 10^{-25}$  (15 pages)