

Lattices, sphere packings and spherical codes: geometric optimization problems

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Sphere packings

Definition

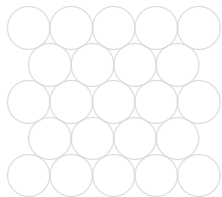
A **sphere packing** in \mathbb{R}^n is a collection of spheres/balls of equal size which do not overlap (except for touching). The **density** of a sphere packing is the volume fraction of space occupied by the balls.

The main question is to find a/the **densest** packing in \mathbb{R}^n .

Good sphere packings

In dimension 1, we can achieve density 1 by laying intervals end to end.

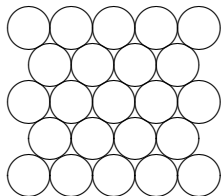
In dimension 2, the best possible is by using the hexagonal lattice. [Fejes Tóth, ~ 1940]



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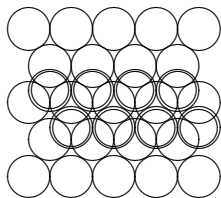
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Good sphere packings II

In dimension 3, the best possible way is to stack layers of the solution in 2 dimensions. [Hales, \sim 1998]

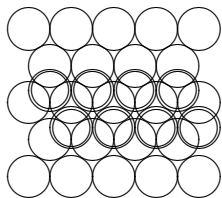


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In dimensions ≥ 4 , we have some guesses for the densest sphere packing. But we can't prove them. In low dimensions, the best known sphere packings come from lattices.

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Lattices

Definition

A **lattice** Λ in \mathbb{R}^n is a discrete subgroup of rank n , i.e. generated by n linearly independent vectors of \mathbb{R}^n .

Example

Lattices are related to **quadratic forms**: if b_1, \dots, b_n is a basis of the lattice $\Lambda \subset \mathbb{R}^n$, then $Q(x_1, \dots, x_n) = \|x_1 b_1 + \dots + x_n b_n\|^2$ is a positive definite quadratic form.

$$\{\text{Lattices up to isometry}\} \leftrightarrow \{\text{Quadratic forms mod change of coords}\}$$
$$O_n(\mathbb{R}) \backslash GL_n(\mathbb{R}) / GL_n(\mathbb{Z}) \cong Sym^2(\mathbb{R}^n)^+ / SL_n(\mathbb{Z}).$$

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Lattice packings

If $m(\Lambda)$ is the shortest length of a non-zero vector of Λ , then we can put spheres of radius $m(\Lambda)/2$ at each point of the lattice.

Density is equal to

$$\text{vol}(B_n(1)) \frac{m(\Lambda)^n}{2^n \det(\Lambda)}$$

where $\det(\Lambda)$ is the volume of the fundamental cell of Λ .

Lattice packings II

The **lattice packing problem** asks for the densest lattice(s) in \mathbb{R}^n .

This is equivalent to the following question about quadratic forms/geometry of numbers:

What's the largest positive real number γ_n such that every positive definite quadratic form $Q(x)$ of determinant 1 in n variables represents a positive value less or equal to γ_n ? (i.e. $\exists x \in \mathbb{Z}^n$ such that $0 < Q(x) \leq \gamma_n$)

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Dense lattices

What are the densest lattices in every dimension?

n	1	2	3	4	5	6	7	8	24
Λ	A_1	A_2	A_3	D_4	D_5	E_6	E_7	E_8	Leech
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Dimensions 8 and 24

Theorem (Cohn-K, \sim 2005)

The Leech lattice is the unique densest lattice packing in \mathbb{R}^{24} , and its density is optimal (among all sphere packings) up to an error of at most $1.65 \cdot 10^{-30}$. The E_8 lattice is the unique densest lattice packing in \mathbb{R}^8 , and its density is optimal among all sphere packings up to an error of at most 10^{-14} .

Note: The error bounds have since been improved quite a lot (in particular, the error for E_8 is less than 10^{-30} as well).

A key ingredient in the proof is the use of linear programming bounds for sphere packing density. We also use a criterion of Voronoi for local optimality in the space of lattices, and some combinatorial and geometric arguments.

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Dense lattices II

The lattice packing problem has a finite solution (Voronoi's theorem implies a finite list of local optima), but the number of these seems to grow very rapidly, so this approach is impracticable beyond $n = 8$ at the current time.

dimension	1	2	3	4	5	6	7	8	9
# local optima	1	1	1	2	3	6	30	2408	?

Strangeness in high dimensions

Even starting in \mathbb{R}^9 , interesting phenomena emerge. For example, the best packings known in dimension 9 are a continuous family, one of which is a lattice, and the others are obtained by moving half the spheres relative to the other half (the **fluid diamond** packings).

In dimension 10, the current record is held by the **Best packing** (40 translates of a lattice, obtained as the inverse image of a non-linear binary code in \mathbb{F}_2^{10} under the reduction $\mathbb{Z}^{10} \rightarrow \mathbb{F}_2^{10}$).

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Covering and quantizer problems

The **covering radius** of a lattice (or more generally, discrete set) $\Lambda \subset \mathbb{R}^n$ is the smallest r such that spheres of radius r centered at points of Λ cover all space. The **thinness** of a covering is the fraction of space wasted. The covering problem asks for the thinnest lattice covering of \mathbb{R}^n .

The Voronoi cell of a point of Λ is the set of points of \mathbb{R}^n closer to it than to any other point of Λ . The **quantizer** problem asks for Λ (with one point per unit volume on average) such that the (average) moment of inertia of the Voronoi cell is smallest.

Both of these problems arise naturally in communication theory.

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Energy minimization

Energy minimization from physics is a good way to make dense arrangements.

Let $f(r)$ be a potential energy function, e.g. $f(r) = 1/r^{2k}$ or $f(r) = e^{-cr^2}$.

If \mathcal{P} is a periodic configuration in \mathbb{R}^n then define f -potential energy of $x \in \mathcal{P}$ to be

$$E_f(x, \mathcal{P}) = \sum_{x \neq y \in \mathcal{P}} f(|x - y|)$$

The f -potential energy of \mathcal{P} is the average of $E_f(x, \mathcal{P})$ over $x \in \mathcal{P}$ (it's a finite average).

Energy minimization problem: Stipulate that the center density $\delta(\mathcal{P})$ is fixed, and ask for \mathcal{P} which minimizes the potential energy.

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Theta and zeta functions

For instance, if $f(r) = 1/r^s$ then for a lattice Λ we get

$$E_f(\Lambda) = \sum_{0 \neq x \in \Lambda} \frac{1}{|x|^s}$$

which is the [Epstein zeta function](#) of the lattice (converges for $s > n$).

If $f(r) = e^{-cr^2}$ then for a lattice Λ we get

$$E_f(\Lambda) = \sum_{0 \neq x \in \Lambda} e^{-c|x|^2} = \Theta_\Lambda(ic/\pi) - 1$$

where

$$\Theta_\Lambda(z) = \sum_{x \in \Lambda} e^{\pi i |x|^2 z}$$

is the [theta function](#) of the lattice.

Completely monotonic potentials

The potential functions we consider are **completely monotonic functions** of squared distance.

That is, $f(r) = g(r^2)$ where $g(x) \geq 0, g'(x) \leq 0, g''(x) \geq 0, \dots$, i.e. derivatives alternate in sign.

This is a natural extension of positive, decreasing, convex functions, and includes Gaussians and inverse power laws. So it's a fairly broad class of functions. But still strong enough to allow us to prove something interesting!

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Spherical codes

A **spherical code** \mathbb{C} is a finite subset of a sphere $S^{n-1} \subset \mathbb{R}^n$.

Some symmetrical examples:

- N vertices of a regular N -gon on S^1 .
- Vertices of Platonic solids on S^2 (tetrahedron, octahedron, cube, icosahedron, dodecahedron).
- Vertices of a 24-cell, 600-cell or 120-cell in S^3 .
- 240 roots of E_8 lattice on S^7 .

Good spherical codes: have large angular distance between distinct points.

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Spherical codes II

The **angular distance** $\theta(C)$ of the code C is the minimal angular separation between distinct points.

We may ask, given N , how to place the points of C such that $\theta(C)$ is maximized. Conversely, given θ_0 , what is the maximum number of points N in a code C with $\theta(C) \geq \theta_0$?

The spherical code problem is the same as packing spherical caps on the surface of a sphere.

For $\theta_0 = \pi/3$, the latter problem becomes the **kissing number** problem.

Answers only known in dimensions 1, 2, 3 (Schutte and van der Waerden), 4 (Musin), 8 and 24 (Odlyzko-Sloane and Levenshtein).

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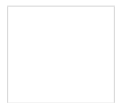
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Connection with potential energy minimization

One way to make good spherical codes is to put N electrons on the surface of a sphere, and let them repel under electrostatic force (Thomson's plum pudding model of the atom).



When they come to equilibrium, expect them to be far apart, i.e. form a good spherical code.

In other words, we can study the problem of energy minimization (in this case $1/r$ potential energy), and expect the ground states to be related to good spherical codes or packings.

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Connection with potential energy minimization

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Energy minimization for spherical codes

Basic question: Find configuration(s) of N points on S^{n-1} which minimize f -potential energy.

Again, we consider completely monotonic functions of squared distance. The cone of such functions is spanned by the functions $A_\ell(r) = (4 - r)^\ell$, for non-negative integers ℓ .

Limits

The spherical coding problem (or sphere packing problem) is a limit case of the energy minimization problem, for e^{-cr^2} as $c \rightarrow \infty$ or of $1/r^k$ as $k \rightarrow \infty$.

This is because the dominant term comes from the minimal distance, and the contribution of other terms become negligible in proportion as the parameters c or k go to infinity.

In fact, the limit problem contains finer information (e.g. about the number of minimal vectors, if the answer to the packing density problem is degenerate).

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Examples

Energy minimization for harmonic potential, for $1/r$ potential.

4 points in S^2 : regular tetrahedron.

6 points in S^2 : regular octahedron.

8 points in S^2 : skew-cube!



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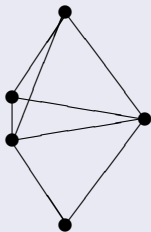
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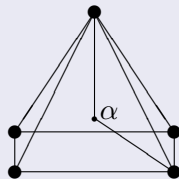
Examples II

5 points in S^2 : two competing configurations.

A : triangular bipyramid



B_θ : square pyramid



$$\alpha = \pi/2 + \theta$$

Examples III

For the function $A_\ell = (4 - r)^\ell$, the configuration A wins for $1 \leq \ell \leq 6$, whereas some B_θ wins for $\ell \geq 7$.

Note that A maximizes angular distance, as does B_0 .

For inverse power laws, B wins for steep power laws $1/r^k$ for $k > 7.524+$, but A wins for smaller k .

Recently, R. Schwartz proved that for $1/r$ and $1/r^2$, the triangular bipyramid (configuration A) is the global optimum.

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Universal optimality

We say a spherical code is **universally optimal** if it minimizes f -potential energy (among codes of its size) for all completely monotonic f .

There are examples of universally optimal codes, though their existence is *very uncommon*. The typical situation is that we have one or more families of N -point configurations, each being optimal for A_ℓ in a certain range of ℓ .

Similarly, we say a periodic configuration \mathcal{P} in \mathbb{R}^n is universally optimal if it minimizes potential energy for all completely monotonic functions f , among point configurations with the same density as \mathcal{P} .

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Examples of universal optima on spheres

Known universally optimal configurations of N points on S^{n-1} :

n	N	Name
2	N	N -gon
n	$n + 1$	simplex
n	$2n$	cross polytope
3	12	icosahedron
4	120	600-cell
8	240	E_8 root system
7	56	spherical kissing
6	27	spherical kissing/Schläfli
5	16	spherical kissing/Clebsch
24	196560	Leech lattice minimal vectors
23	4600	spherical kissing
22	891	spherical kissing
23	552	regular 2-graph
22	275	McLaughlin
21	162	Smith
22	100	Higman-Sims
$q \frac{q^3+1}{q+1}$	$(q+1)(q^3+1)$	Cameron-Goethals-Seidel

Examples of universal optima on spheres II

Theorem (Cohn-K)

These are sharp for the linear programming bounds for potential energy and hence universally optimal. All the examples except for the 600-cell are sharp configurations.

Definition

A **spherical M -design** is a code C for which we have

$$\frac{1}{|C|} \sum_{x \in C} p(x) = \frac{1}{\text{vol}(S^{n-1})} \int_{S^{n-1}} p(x) d\omega(x)$$

for any polynomial p of degree at most M .

We say C is a **sharp** configuration if there are m different inner products between distinct points, and it is a $2m - 1$ design.

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Positive definite kernels

Fix $n \geq 2$. We say $f : [-1, 1] \rightarrow \mathbb{R}$ is a **positive definite kernel** if for every code $C \subset S^{n-1}$, the $|C| \times |C|$ matrix $(f(\langle x, y \rangle))_{x, y \in C}$ is positive semidefinite.

In particular, $\sum_{x, y \in C} f(\langle x, y \rangle) \geq 0$.

Schönberg (1930s) classified all the positive definite kernels. He showed that the ultraspherical or Gegenbauer polynomials $C_i^\lambda(t)$, $i = 0, 1, 2, \dots$ are PDKs and that any PDK is a non-negative linear combination of them. Here $\lambda = n/2 - 1$.

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Gegenbauer polynomials

The Gegenbauer polynomials arise from representation theory/harmonic analysis. They are given by the generating function

$$(1 - 2tz + z^2)^{-\lambda} = \sum_{i=0}^{\infty} C_i^\lambda(t) z^i$$

So we have

- 1 $C_0(t) = 1$
- 2 $C_1(t) = (n - 2)t$
- 3 $C_2(t) = (n - 2)(nt^2 - 1)/2$

and so on.

Linear programming bounds

The linear programming bounds of Delsarte for the spherical code problem (maximize N for a given θ), were adapted by Yudin to give LP bounds for potential energy.

Theorem (Yudin)

Let $f : (0, 4] \rightarrow \mathbb{R}$ be any function. Suppose $h : [-1, 1] \rightarrow \mathbb{R}$ is a polynomial such that $h(t) \leq f(2 - 2t)$ for all $t \in [-1, 1]$, and suppose there are nonnegative coefficients $\alpha_0, \dots, \alpha_d$ such that $h(t) = \sum_{i=0}^d \alpha_i C_i^\lambda(t)$ in terms of the Gegenbauer (i.e. ultraspherical) polynomials. Then every set of N points on S^{n-1} has potential energy at least $N^2 \alpha_0 - Nh(1)$.

Proof of LP bound for Potential energy

Proof.

$$\begin{aligned} E_f(C) &= \sum_{x,y \in C, x \neq y} f(|x - y|^2) \geq \sum_{x,y \in C, x \neq y} h(\langle x, y \rangle) \\ &= -Nh(1) + \sum_{x,y \in C} h(\langle x, y \rangle) \\ &= -Nh(1) + \sum_{x,y \in C} \sum_i \alpha_i C_i(\langle x, y \rangle) \\ &= -Nh(1) + \sum_i \alpha_i \sum_{x,y \in C} C_i(\langle x, y \rangle) \\ &= -Nh(1) + N^2 \alpha_0 + \sum_{i>0} \alpha_i \sum_{x,y \in C} C_i(\langle x, y \rangle) \\ &\geq -Nh(1) + N^2 \alpha_0 \end{aligned}$$

□

Proof of universal optimality

Proof idea.

We construct $h(t)$ to be the Hermite interpolation of $f(2 - 2t)$ to order 2 at the set of inner products of distinct points of the code (except at -1 , where we interpolate to order 1).

Show $h(t) \leq f(2 - 2t)$ and that $h(t)$ is positive definite (which is also used in the proof of uniqueness).

The 600-cell involves an extra twist: we need a polynomial of somewhat higher degree with some vanishing Gegenbauer coefficients. □

Apart from sphere packing bounds and universal optimality, LP bounds have been used in many other settings, for instance by Odlyzko-Sloane and Levenshtein to solve the kissing number problem in 8 and 24 dimensions, and by Musin to solve it in 4 dimensions.

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Linear programming bounds for Euclidean space

Bochner's Theorem: A function on \mathbb{R}^n is positive definite exactly when its Fourier transform is non-negative.

Theorem (Cohn-K)

Let $f : (0, \infty) \rightarrow [0, \infty)$ be any function. Suppose $h : \mathbb{R}^n \rightarrow \mathbb{R}$ satisfies $h(x) \leq f(|x|^2)$ for all $x \in \mathbb{R}^n \setminus \{0\}$ and is the Fourier transform of a function $g \in L^1(\mathbb{R}^n)$ such that g is continuous at 0 and $g(t) \geq 0$ for all $t \in \mathbb{R}^n$. Then every periodic configuration in \mathbb{R}^n with density δ has f -potential energy at least

$$\delta g(0) - h(0).$$

Dimensions 1, 2, 8, 24

We can show that the LP bound is sharp for $\mathbb{Z} \subset \mathbb{R}$ (nontrivial!).

Conjecture

This LP bound is sharp for the hexagonal lattice, E_8 , and the Leech lattice, for all completely monotonic potential functions which decay sufficiently rapidly.

This implies universal optimality of these lattices. We prove that the conjecture implies that E_8 and the Leech lattice are the unique densest periodic packings in 8 and 24 dimensions.

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Survey of results, conjectures

Sarnak and Strömbergsson have shown that D_4, E_8 and the Leech lattice are **locally optimal** among lattices for potential energy for all completely monotonic functions.

Coulangeon showed that any lattice Λ whose shells are all 4-designs is locally optimal for the Epstein zeta function,

$$\zeta(\Lambda, s) = \sum_{x \in \Lambda - \{0\}} \frac{1}{|x|^{2s}}$$

which is the f -potential energy for $f(r) = 1/r^s$.

In particular, this holds for A_2, D_4, E_8 and Leech. Recent result of Coulangeon and Schürmann extends this to local optimality of these among all periodic configurations.

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Energy minimization for periodic configurations

Cohn-K-Schürmann '09: computer simulations for $f = e^{-cr^2}$ for various c , dimension $n \leq 8$, $N \leq 10$. Gradient descent on space of periodic configurations with fixed number of translates.

Remarks:

- $c \rightarrow \infty$ is the sphere packing limit.
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- $n = 1$: [Cohn-K] proved \mathbb{Z} is always optimal and unique.
- $n = 2$: We can't prove it, but expect A_2 to be always optimal, and experiments confirm this.
- $n = 3$: For $c \gg 1$ get A_3 . For $c \approx 0$ get A_3^* (duality).
- $n = 4$. Always seem to get D_4 . No proof!

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Optimizers in dimension 5

In each of these dimensions, the experimentally observed minima seem to occur in a family of periodic configurations obtained by glueing together two lattices along their holes.

Let $D_5^+ = D_5 \cup (D_5 + (1/2, \dots, 1/2))$, and $D_5^+(\alpha)$
 $= \{(x_1, \dots, x_4, \alpha x_5) \mid x \in D_5^+\}$.

These are non-lattices (union of 2 translates of a lattice).

For $c \gg 1$ we get $D_5^+(2)$ and for c close to zero we get $D_5^+(1/2)$.

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Dimension 6

Get E_6 for $c \rightarrow \infty$, and E_6^* for $c \rightarrow 0$.

But in the middle we get a non-lattice, obtained by “gluing” D_3 and D_3 along their holes, and stretching.

Let P_6 be $D_3 \oplus D_3$ along with its three translates by $(1/2, \dots, 1/2)$, $(1, 1, 1, -1/2, -1/2, -1/2)$ and $(-1/2, -1/2, -1/2, 1, 1, 1)$.

Let $P_6(\alpha)$ be obtained by scaling the first three coordinates of P_6 by α and the last three by $1/\alpha$.

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Dimensions 7 and 8

Dimension 7: We get $D_7^+(\alpha)$ where α varies depending on c . As $c \rightarrow \infty$ we get $D_7^+(\sqrt{2}) \cong E_7$.

Dimension 8: Get E_8 always, in accordance with [Cohn-K] conjecture of universal optimality.

Dimensions 9 and above: More interesting phenomena, but calculations get much harder.

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For $n = 9$, seem to always get D_9^+ (no scaling!)

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For any lattice Λ , we have its dual lattice

$$\Lambda^* = \{y \in \mathbb{R}^n \mid \langle x, y \rangle \in \mathbb{Z} \quad \forall x \in \Lambda\}.$$

We know $\text{vol}(\mathbb{R}^n/\Lambda^*) = 1/\text{vol}(\mathbb{R}^n/\Lambda)$, $(\Lambda^*)^* = \Lambda$, etc.

Poisson summation formula: For any nice function $f : \mathbb{R}^n \rightarrow \mathbb{R}$ (e.g. Schwartz function),

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$$\Lambda^* = \{y \in \mathbb{R}^n \mid \langle x, y \rangle \in \mathbb{Z} \quad \forall x \in \Lambda\}.$$

We know $\text{vol}(\mathbb{R}^n/\Lambda^*) = 1/\text{vol}(\mathbb{R}^n/\Lambda)$, $(\Lambda^*)^* = \Lambda$, etc.

Poisson summation formula: For any nice function $f : \mathbb{R}^n \rightarrow \mathbb{R}$ (e.g. Schwartz function),

$$\sum_{x \in \Lambda} f(x) = \frac{1}{\text{vol}(\mathbb{R}^n/\Lambda)} \sum_{y \in \Lambda^*} \widehat{f}(y)$$

where $\widehat{f}(y) = \int_{\mathbb{R}^n} f(x) e^{2\pi i \langle x, y \rangle} dx$

(Useful for establishing functional equation for zeta function, etc.)

Formal duality

Can the same hold for periodic configurations \mathcal{P} and \mathcal{Q} ? i.e. Can we have

$$\sum_{x \in \mathcal{P}} f(x) = \delta(\mathcal{P}) \sum_{y \in \mathcal{Q}} \hat{f}(y)$$

Theorem of Cordoba says this cannot happen for all Schwartz functions f : it would force \mathcal{P} to be a lattice.

But we're really only interested in

$$\Sigma'(f, \mathcal{P}) = \text{Average}_{x \in \Lambda} \left[\sum_{y \in \Lambda, y \neq x} f(x - y) \right]$$

where Σ' means diagonal terms (with $x = y$) are omitted, and only differences of lattice vectors matter.

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Formal duality, contd.

Say \mathcal{P} and \mathcal{Q} are **formal duals** if $\Sigma'(f, \mathcal{P}) = \delta(\mathcal{P})\Sigma'(\hat{f}, \mathcal{Q})$.

Theorem (Cohn-K-Schürmann)

D_n^+ is formally self-dual when n is odd or n is a multiple of 4. If $n \equiv 2 \pmod{4}$, then D_n^+ is formally dual to an isometric copy of itself.

Corollary

$D_n^+(\alpha)$ is formally dual to an isometric copy of $D_n^+(1/\alpha)$.

Similarly, $P(\alpha)$ is formally self-dual.

So if f is radially symmetric, the Gaussian potential energies are related.

In joint work with Cohn, Reiher and Schürmann, we have found some other examples of formal duality.

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Inverse problem

What happens if we evolve 8 points on S^2 under a $1/r^k$ potential?

The minimum for energy is not a cube. Rather, it's a skew cube (antiprism), where the distance between the two square faces varies as k varies.

Similarly, 20 points on S^2 don't settle down to a regular dodecahedron under the inverse power laws or Gaussians.

Can we design a potential function which is minimized by the cube?

Can do it with potential wells, but we want a nicer function.

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Theorem (Cohn-K)

Let $f(r) = 1/r + r/3 - 8r^2/11 + 2r^3/9 - r^4/50$. The cube is the unique global minimum for f -potential energy among 8-point codes in S^2 .

Proof:

Linear programming bounds! We engineer f so that it's easy to come up with an h that works and gives a sharp bound for the cube. But note that f is in fact decreasing and convex as a function of distance (even though not completely monotonic). □



Similarly, we can design a potential function for the regular dodecahedron, the 4-dimensional hypercube and the 120-cell. Would like to do this for nice lattices (e.g. \mathbb{Z}^n).

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Some open problems/to-do list

- Are there only finitely many universal optima in a given dimension?
- How many local optima are there? Systematic upper/lower bounds?
- Is it possible to beat the D_4 lattice for energy among lattices or periodic configurations?
- Show A_2 is universally optimal among all periodic configurations in \mathbb{R}^2 .
- Find the “magic functions” for E_8 and the Leech lattice to show that they are the densest sphere packings in their dimensions. More generally, to show they’re universally optimal.

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