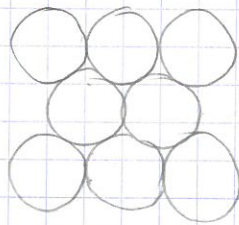


We are going to consider sphere packing, identical... perfect spheres → easiest non-trivial problem.  
 We are going to consider arbitrary dimensions  $\mathbb{R}^m$  (rk: applications for information theory).

**INTRODUCTION**

→ Problem: maximize density of spheres, that can be tangent but are not allowed to overlap!  
 (= fraction of space covered).

$2d/\mathbb{R}^2$ :

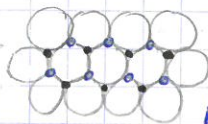


→ optimal packing, proof by Thue 1992  
 this pretty well understood because in 2d there is no geometrical frustration (local vs global way to behave in competition).

(hexagonal)

Rk: boundary conditions are not so important, think of torus which we would go to infinity, infinite space...

$\mathbb{R}^3$ : Kepler conjecture (pile of oranges) → stack 2d hexagonal layers - (2 ways to choose how to position a layer above another)



place additional layer over blue/black

↳ many ≠ packings of identical density corresponding to the ≠ choices of positioning successive layers -

→ Not at all obvious to prove, although done (Hales 1998, 2014).  
 Because there is here frustration, so not very understandable proof (eg: max 12 neighbors, although to obvious)

So what do we know: solutions for  $n = 1, 2, 3, 8, 24$

↳ 2016 Kumar, Miller-Ro..., Viazovska, Cohn - 2016 Viazovska

For arbitrary dimension:  $\frac{\text{upper bound}}{\text{low bound}}$  grows exponentially with the dimension.

↓  
 and this is because any how, a 1% change in distance →  $1.01^m$  change in volume → density → scaling problem.

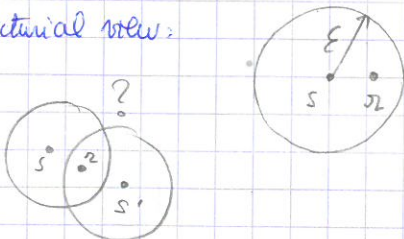
Surprisingly, each dimension behaves a bit differently → even at the non-sugorous level no intuition from one to the other...

**MOTIVATION**

A Motivation to study sphere packing is that they can be seen as ERROR CORRECTING CODES

$m$  measurements (signal)  $s \in \mathbb{R}^n$  → communication channel →  $\pi \in \mathbb{R}^n$  received.  
 noisy  
 ↳ measure of the noise level  $\| \pi - s \| \leq \epsilon$

Pictorial view:



error ball surrounding each possible signal

↳ we see that we wish for these not too overlap so that we do not make mistakes in interpreting  $\pi$ .

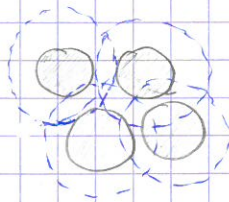
1948 → consider a finite set of signals, which even bells don't overlap  
 Shannon → unambiguous decoding.  
 → still we want to maximize the density. → maximize communication rate.

**A PROOF**

Why does there exist good packings in high-dimension? A proof of a lower bound.

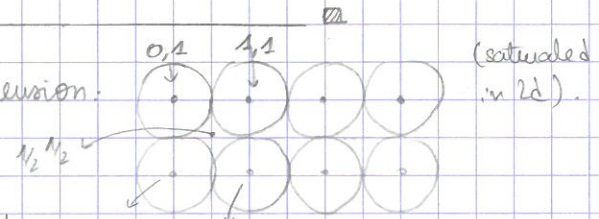
**THEOREM:** maximum density in  $n$ -dimension  $\geq 2^{-n}$

**PROOF:** Take any saturated packing (impossible to add a sphere)  
 doubling the radius results in a complete coverage → multiply volume covered by  $2^m$



$\Rightarrow V \times \text{density} \times 2^m \geq V$   
 $\Rightarrow \text{density} \geq 2^{-m}$

**RR:** The square packing is not saturated in high dimension.



holes at  $(1/2, 1/2, \dots, 1/2)$ .

$\Rightarrow$  distance from  $(0,0) \rightarrow \sqrt{(1/2)^2 + \dots + (1/2)^2} = \frac{\sqrt{m}}{2} !!$

$\Rightarrow$  not saturated for  $\frac{\sqrt{m}}{2} \geq 1 \rightarrow m \geq 4$ .

$\mathbb{Z}^m$  density =  $\frac{\pi^{m/2}}{(m/2)!} \frac{1}{2^m}$   
 volume of a sphere of  $r=1/2$

07/07/2017

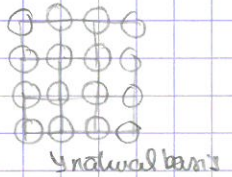
lower bounds: density  $> c n 2^{-n}$   
 (sometimes  $\log \log n$ )

lower bounds: density  $\leq 2^{-0.599n}$

↙ We don't know if optimal packings should be perfect crystals, or look more random...  
 ↘ We don't know if an exponential improvement is possible?

**HOW CAN WE DESCRIBE PACKINGS?**

maths lattice      periodic packing  
 physics Bravais lattice      lattice



Bravais lattice: basis  $v_1, \dots, v_n$  for  $\mathbb{R}^n$   
 center of the spheres at  $a_1 v_1 + \dots + a_n v_n, a_i \in \mathbb{Z}$

what is the density of Bravais lattice?

- packing radius = half minimum vector length
- volume of fundamental cell =  $|\det(\text{basis})|$

$\Rightarrow \text{density} = \frac{\text{volume sphere}}{\text{volume fund. cell.}}$



The basis given, need not be  $v_1 = (1, 0, 0, \dots)$  etc. In practice for the skewed lattice, this is very hard to compute.

Finding the minimum vector length for the given basis is as  $n \rightarrow \infty$ .

NP hard problem

Are lattices optimal?

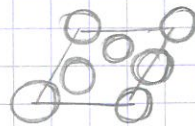
- Well they are incredibly constrained,  $n^2$  parameters to adjust the lattice  
 [exponential number of holes that you might want to try to fill.]

↙ **CONJECTURE:** In sufficiently large dimension, there is no saturated Bravais lattice -  
 think 1000. (e.g. 19-dim best known packing on a Bravais lattice).

If they are not saturated, they must be at least by a factor of 2 suboptimal.

↳ Bravais lattices are not good, but easy for us to handle...

Periodic packing := union of translate of a Bravais lattice  
= translation of fundamental cell.



↳ come arbitrarily close to optimal density  $\equiv$  anything can be approximated periodically  
↳ big enough box of original packing  
↳ share spheres on the edges  
↳ repeat  
→ approximation of the density will be better and better the bigger the box gets.  
(in the limit  $\rightarrow \infty$ , we lose periodicity)

↳ but do periodic packings achieve exactly the optimal density?

e.g. Best known packing in  $\mathbb{R}^{10}$  is periodic with 40 parts/cell, 8% denser than any Bravais lattice.

### A COMPUTATIONAL PROBLEM: FINDING SHORT VECTORS

1\* Can we take advantage of the computational cryptography?

↳ handful of mathematical problems are really well-suited for public-key encryption (almost no chance of people breaking them by tomorrow).

↳ factoring, discrete logarithm... → YET, could be broken by quantum computers  
lattices → quantum secure?

Goldreich-Goldwasser-Halevi (Don't use :))

↳ How to encode messages using packings?

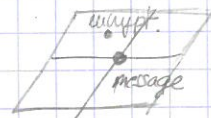
PUBLIC KEY (encryption)  
everybody can send me  
a message

PRIVATE KEY (decryption)  
⇒ only I can read it.

= BRAVAIS LATTICE BASIS -  
(ugly basis)

= SECRET NEARLY ORTHOGONAL BASIS for some  
lattice.

And a message  $\equiv$  lattice point → perturb point  
off the lattice



decrypt. what is the nearest lattice point? → very hard to solve straight away  
→ much easier with a nearly orthogonal basis.

2\* Embedding numbers recognition in the short vector problem:

do you recognize:  $\alpha = -7,82646099323767 \dots$  ? close rational!  
eg:  $0,1315345345345$   
 $\approx \frac{1}{10} + \frac{345}{9990}$

→ in particular, recognize algebraic numbers  $\equiv$  roots of polynomial equations of integer coefficients

### ↳ Mapping to sphere packing

- consider a very big constant  $c = 10^{20}$
- consider the basis:  $(1, 0, 0, 0, \dots, c)$   
 $(0, 1, 0, 0, \dots, c\alpha)$   
 $(0, 0, 1, 0, \dots, c\alpha^2)$

↳ Bravais lattice:  $\sum a_i v_i = (\underbrace{a_0, a_1, \dots}_{\text{pretty small}}, \underbrace{c \sum \alpha_i^i}_{\text{huge}})$   
 that we would wish to be tiny to have a short vector!

→ find  $\{a_i\}$  so that last  $\approx 0$ ,  $\alpha$  approximate root  $\equiv$  find simplest polym. = find density of Bravais lattice.

in our example of 6 dimensional lattice embedded in 7-dimension:

$$c \rightarrow (a_0, a_1, \dots, a_0 + a_5 \alpha^5) = (71, -5, 12, -19, 132, 0.000004)$$

### ELEMENTS OF BOUNDS COMPUTATIONS

1. \* pair correlation function  $\equiv$  "number of times pairwise distances occur"

↳ Fourier transform: structure factor  $\geq 0$  → constraints on plausible pair correlation functions → bounds by showing that could not be improved without structure factor going below zero -

determines packing density ↳ can't prove it!

→ argument working in 1, 2?, 8, 24.

2. Recall the Fourier transform:  $f: \mathbb{R}^n \rightarrow \mathbb{R}$ ,  $\hat{f}(t) = \int_{\mathbb{R}^n} f(x) e^{2\pi i \langle t, x \rangle} dx$ .

Poisson summation: Consider Bravais lattice  $\Lambda$  in  $\mathbb{R}^n$ ,  $\sum_{x \in \Lambda} f(x) = \frac{1}{\text{Vol}(\mathbb{R}^n/\Lambda)} \sum_{t \in \Lambda^*} \hat{f}(t)$   
↑ ↓  
 fundamental cell lattice dual lattice

Theorem (Cohn-Elkies 2003): let  $f: \mathbb{R}^n \rightarrow \mathbb{R}$  (nice) s.t.  $f(x) \leq 0$  for  $\|x\| \geq 2$   
 $\hat{f}(t) \geq 0 \forall t$  and  $\hat{f}(0) = 0$

then the sphere packing density in  $\mathbb{R}^n \leq \frac{\pi^{n/2}}{(n/2)!} \frac{f(0)}{\hat{f}(0)}$

PROOF FOR BRAVAIS LATTICES: Bravais lattice  $\Lambda \subset \mathbb{R}^n$  with minimum vector length  $\geq 1$  (unit spheres)

$$\hat{f}(0) \geq \sum_{x \in \Lambda} f(x) = \frac{1}{V} \sum_{t \in \Lambda^*} \hat{f}(t) \geq \frac{\hat{f}(0)}{V} \rightarrow \frac{1}{V} \leq \frac{\hat{f}(0)}{\hat{f}(0)} \text{ yet density} = \frac{\pi^{n/2}}{(n/2)!} \frac{1}{V} \quad \square$$

fk. taking beautiful duality and throwing all the complicated -  
 → no other choice, we don't know about all the nontrivial terms  
 → we might be lucky enough that actually those terms are decaying fast, and we are not losing much!