Heating the sphere

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# Gimme points



Pollen particles: *stellaria holostea* and *iris decora*. Rob Kesseler and Madeline Harley

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# Little history and incomplete list of researchers involved.



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# Little history and incomplete list of researchers involved.

- Thomson's problem. J. J. Thomson, 1904. Energy minimization and more: see references in next slices.
- Tammes problem (1930). Habicht, Schutte, van der Waerden, Danzer, Fejes Toth, Cohn, Jiao, Kumar, Torquato, Brauchart, Dick, Saff, Sloan, Wang, Womersley,
- Quadrature formulas (spherical *N*-designs), spherical harmonics and interpolation. Hesse, Sloan, Womersley, Aistleitner, Brauchart,Dick, Bondarenko, Radchenko, Viazovska
- Maximal distance sums. Alexander, Beck, Stolarski.
- Number Theory and Arakelov Theory. Elkies, Baker.
- One component plasma Coulomb gases at zero temperature. Sandiers, Serfaty.

#### Points satisfying some "extremal" property A frequent choice

Look for N points  $x_1, \ldots, x_N$  in the sphere S such that the logarithmic energy (aka logarithmic potential)

$$\mathcal{E}(x_1, \dots, x_N) = \log \prod_{i < j} \|x_i - x_j\|^{-1} = -\sum_{i < j} \log \|x_i - x_j\|$$

is minimized.

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is minimized.

A set of N points in S minimizing  $\mathcal{E}$  (i.e. maximizing the product of their mutual distances) is called a set of **Elliptic Fekete Points**.

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Early works by Fekete, Szegö, Whyte, Hille, Tsuji, etc.

For  $X = (x_1, \ldots, x_N) \in \mathbb{S}^N$  where  $x_i \in \mathbb{S}$ ,  $1 \le i \le N$ , ellipic Fekete points minimize the logarithmic energy

$$\mathcal{E}(X) = \mathcal{E}(x_1, ..., x_N) = \log \prod_{i < j} ||x_i - x_j||^{-1} = -\sum_{i < j} \log ||x_i - x_j||$$

Equivalently, they maximize the product of their mutual distances.

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Equivalently, they maximize the product of their mutual distances. Let

$$m_N = \min\{\mathcal{E}(X) : X \in \mathbb{S}^N\}.$$

Smale's 7th problem: can one find  $X \in \mathbb{S}^N$  such that

$$\mathcal{E}(X) - m_N \leq c \log N?$$

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"Can one find" means...can one describe a polynomial time algorithm (BSS model)?

# The minimal value of the energy.

Theorem (Elkies, Wagner, Rakhmanov–Saff–Zhou, Dubickas, Brauchart, Sandiers–Serfaty, Bétermin)

For the radius 1/2 sphere, we have:

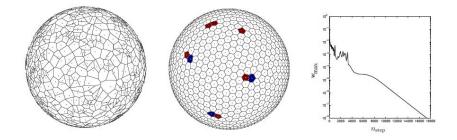
$$m_N = \frac{N^2}{4} - \frac{N \ln(N)}{4} + C_N N + o(N),$$

where

$$-0.4593423... \le \lim_{N \to \infty} C_N \le -0.40217...$$

Conjecture [Brauchart, Hardin, Saff; Serfaty et al]:  $\lim_{N \mapsto \infty} C_N = 2 \log 2 + \frac{1}{2} \log \frac{1}{3} + 3 \log \frac{\sqrt{\pi}}{\Gamma(1/3)} = -0.40217...$ 

# Approximation to 1000 elliptic Fekete points by Bendito, Carmona, Encinas, Gesto, Gómez, Mouriño, Sánchez



#### We do know some things Separation distance for the sphere of radius 1/2

• Theorem (Toth, Habicht- van der Waerden) For the Tammes problem (maximize separation distance)

$$d_{
m sep}(X_{Tammes}) pprox rac{1.9046...}{\sqrt{N}}.$$

• Theorem (Rakhmanov–Saff–Zhou,Dubickas,Dragnev) For the elliptic Fekete points,

$$rac{1}{\sqrt{N-1}} \leq d_{ ext{sep}}(X_{ extsf{Fekete}}) \leq rac{1.9046...}{\sqrt{N}}.$$

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## We do know some things

Baricenter [Bergersen-Boal-Palffy Muhoray], [Dragnev-Legg-Townsend]. True for any critical point of  $\mathcal{E}$ . [Brauchart] for the discrepancy, [Leopardi] for the comparison to *s*-energy.

Let  $x_1, \ldots, x_N$  be a set of elliptic Fekete points.

- The baricenter of  $x_1, \ldots, x_N$  is the center of the sphere.
- For each *i*,

$$\sum_{j\neq i}\frac{x_i-x_j}{\|x_i-x_j\|^2}=2(N-1)x_i, \quad \sum_{j\neq i}\|x_i-x_j\|^2=\frac{N}{2}.$$

- Spherical cap discrepancy  $cN^{-1/4}$  (see later).
- Asymptotically optimal s-energy in relative error (see later).

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Facility location problems A modern classical subject on Optimization

# Thanks to Giuseppe Buttazzo for a comment in the ADORT'10 meeting (Barcelona)

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#### Facility location problems A modern classical subject on Optimization

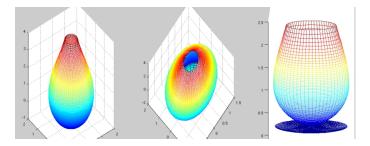
Choose *N* points in the 2 dimensional sphere S in such a way that the average temperature in S is the greatest possible.

Here, the temperature u = u(x, t) is assumed to satisfy the standard diffusion equation  $u_t = \Delta u - \lambda$ , where  $\lambda$  is a cooling rate, constant in  $\mathbb{S}$ , and the heat sources are assumed to be "infinite".

#### The logarithm function in the sphere The graphic corresponds to the function $x \mapsto -\log ||x - (0, 0, 1)||$

Recall that S is the Riemann sphere, that is the sphere of radius 1/2 centered at (0,0,1/2). Let

$$egin{array}{rcl} {\mathcal F}_q: & {\mathbb S}\setminus\{q\} & o & {\mathbb R} \ & p & \mapsto & \log \|p-q\|^{-1} \end{array}$$



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# The logarithm function in the sphere

Harmonic properties of the logaritmic energy

Recall that S is the Riemann sphere, that is the sphere of radius 1/2 centered at (0,0,1/2). Let

$$egin{array}{rcl} {F_q}: & \mathbb{S}\setminus\{q\} & o & \mathbb{R} \ & p & \mapsto & \log \|p-q\|^{-1} \end{array}$$

The (Riemannian) Laplacian of this function is constant:

$$\Delta F_q(p) = 2 \quad \forall p \in \mathbb{S} \setminus \{q\}.$$

### Facility location problems A modern classical subject on Optimization

Choose *N* points in the 2 dimensional sphere S in such a way that the average temperature in S is the greatest possible.

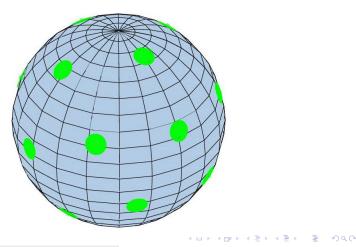
Here, the temperature u = u(x, t) is assumed to satisfy the standard diffusion equation  $u_t = \Delta u - \lambda$ , where  $\lambda$  is a cooling rate, constant in  $\mathbb{S}$ , and the heat sources are assumed to be "infinite".

After some assumptions on the rate of growth near the sources, the following stationary solution is found:

$$u(x) = u(x, t) = \frac{\lambda}{2N} \sum_{i=1}^{N} \log ||x_i - x||^{-1} + u_0.$$

# A new integral formula for the logarithmic energy [B. 2014]

Let  $X = (x_1, ..., x_N)$  be the center of the balls. Then,  $\mathcal{E}(X)$  is up to a constant the integral in the grey part of a certain function.



# A new integral formula for the logarithmic energy [B. 2014]

Let  $X = (x_1, ..., x_N) \in \mathbb{S}^N$ . Assume that caps of radius  $\operatorname{arcsin} \sqrt{\delta/N}$  do not overlap. Let

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 $B_0 =$  the grey area



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 $B_0 =$  the grey area

Then

$$\mathcal{E}(X) = Constant(N, \delta) - \frac{1-\delta}{2\delta} N \oint_{x \in B_0} \sum_{i=1}^N \log \|x - x_i\|^{-1} dx.$$
(1)

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# An immediate consequence

Elliptic Fekete Points vs. Heat sources

#### Corollary

The following problems are equivalent:

- The N-tuple X = (x<sub>1</sub>,...,x<sub>N</sub>) is a set of elliptic Fekete points.
- For any  $\delta \in (0, 1)$  and  $r = \arcsin \sqrt{\delta/N}$  such that  $d_R(x_i, x_j) \ge 2r$  for  $i \ne j$ , heat sources located at the points  $x_1, \ldots, x_N$  maximize the average temperature out of a safety radius r around the sources.

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Moreover... the *total average temperature in*  $\mathbb{S}$  is independent of the location of the sources.

Definition and theorems by Beck, Aistleitner, Brauchart, Dick, Gotz

$$D_C(X) = \sup_{x \in \mathbb{S}, r \in [0, \pi/2]} \left| \frac{\sharp(i \colon x_i \in B(x, r))}{N} - \frac{Area(B(x, r))}{\pi} \right|.$$

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$$cN^{-3/4} \leq \min_{X} D_{C}(X) \leq CN^{-3/4} \log N.$$

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$$cN^{-3/4} \leq \min_{X} D_{C}(X) \leq CN^{-3/4} \log N.$$

If X is a set of Elliptic Fekete points,

$$D_C(X) \leq O(N^{-1/4}).$$

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This follows from our main theorem

#### Theorem

Let  $X \in \mathbb{S}^N$ ,  $N \ge 2$  and let  $\delta \in (0, 1)$  be such that  $d_R(x_i, x_j) \ge 2 \arcsin \sqrt{\delta/N}$  for  $i \ne j$ . Then,

$$\mathcal{E}(X) \leq m_N + rac{N^2}{4} D_C(X) \log rac{N}{2\delta} + rac{N \log(8\pi\delta)}{4}$$

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# Theorem Let $X \in \mathbb{S}^N$ , $N \ge 2$ and let $\delta \in (0,1)$ be such that $d_R(x_i, x_j) \ge 2 \arcsin \sqrt{\delta/N}$ for $i \ne j$ . Then, $\mathcal{E}(X) \le m_N + \frac{N^2}{4} D_C(X) \log \frac{N}{2\delta} + \frac{N \log(8\pi\delta)}{4}$ .

Wagner proved a similar result for the case that we have the unit circle instead of  $\mathbb{S}.$ 

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Theorem  
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$$X \in \mathbb{S}^N$$
,  $N \ge 2$  and let  $\delta \in (0, 1)$  be such that  
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Wagner proved a similar result for the case that we have the unit circle instead of  $\mathbb{S}.$ 

This is somehow a reciprocal of the known result that Elliptic Fekete points have small discrepancy [Brauchart] and are well–separated [Rakhmanov–Saff–Zhou, Dubickas, Dragnev].

This follows from our main theorem

Theorem

Let  $X \in \mathbb{S}^N$ ,  $N \ge 2$  and let  $\delta \in (0, 1)$  be such that  $d_R(x_i, x_j) \ge 2 \arcsin \sqrt{\delta/N}$  for  $i \ne j$ . Then,

$$\mathcal{E}(X) \leq m_N + rac{N^2}{4} D_C(X) \log rac{N}{2\delta} + rac{N \log(8\pi\delta)}{4}.$$

So... Small discrepancy plus not too small separation implies small energy.

# Relation to other sets of points

A consequence of the last theorem

Corollary

Fix  $s \in (0,2)$ . If  $X_N$  minimizes the Riesz s-energy

$$\sum_{1 \le i < j \le N} \|(X_N)_i - (X_N)_j\|^{-s}$$

for  $N \ge 2$ , then  $\lim_{N\to\infty} \mathcal{E}(X_N)/m_N = 1$ . This is a reciprocal to a result by P. Leopardi.

# Relation to other sets of points

Schiffmann; Sloan, Womersley; Marzo, Ortega-Cerdá, Weymar

Optimal interpolation points:  $x_j$  which maximise det  $\phi_i(x_j)$  where  $\phi_i$  form an o.n. basis of spherical harmonics of degree *L*.

#### Corollary

For every  $L \ge 2$ , let  $X_{\pi_L} = (x_1, ..., x_{\pi_L})$  be a set of (non–elliptic) Fekete points. Then

$$\lim_{L\to\infty}\frac{\mathcal{E}(X_L)}{m_{\pi_L}}=1.$$

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I do not want to cheat you: this is **not** so good.

# The critical set of $\ensuremath{\mathcal{E}}$

Laplacian and Maximum Principle

Recall: for  $X = (x_1, ..., x_N) \in \mathbb{S}^N$ , where  $\mathbb{S}^N$  has the product Riemannian structure,

$$\mathcal{E}(x_1,...,x_N) = \log \prod_{i < j} ||x_i - x_j||^{-1} = -\sum_{i < j} \log ||x_i - x_j||.$$

Then:

•  $\Delta \mathcal{E} = 2N(N-1)$ .

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#### The critical set of $\ensuremath{\mathcal{E}}$

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Then:

- $\Delta \mathcal{E} = 2N(N-1).$
- Thus, there exist no local maxima of  $\mathcal{E}$ .



#### The critical set of ${\ensuremath{\mathcal E}}$

A concept from game theory

A "Nash equilibrium" is a tuple  $X = (x_1, \ldots, x_N)$  such that  $\mathcal{E}(X)$  cannot be improved if only one of the  $x_i$  is moved.

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#### The critical set of $\ensuremath{\mathcal{E}}$

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A "Nash equilibrium" is a tuple  $X = (x_1, \ldots, x_N)$  such that  $\mathcal{E}(X)$  cannot be improved if only one of the  $x_i$  is moved. This is also called a componentwise minimum. A corollary from our main result:

#### Corollary

Let X be a Nash equilibrium of  $\mathcal{E}$ . Then,

$$\mathcal{E}(X) < rac{N^2}{4}.$$
 (optimal to the first order term)

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Shub and Smale's condition number

Let  $f : \mathbb{C} \to \mathbb{C}$  be a polynomial of degree N and let  $\zeta \in \mathbb{C}$  be a zero of f. Let

$$\mu(f,\zeta) = \frac{N^{1/2}(1+\|\zeta\|^2)^{\frac{N-2}{2}}}{|f'(\zeta)|} \|f\|_{B-W}.$$

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This is the *condition number*, which actually controls the sensibility of the zero  $\zeta$  to perturbations of f. Let

$$\mu(f) = \max(\mu(f,\zeta) : f(\zeta) = 0).$$

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$$\mu(f) = \max(\mu(f,\zeta) : f(\zeta) = 0).$$

Theorem (Shub–Smale)

For every polynomial f, we have  $\mu(f) \ge 1$ . For random f, with probability at least 1/2 we have  $\mu(f) \le N$ .

Best conditioned polynomials.

So, for many polynomials,  $\mu(f) \leq N$ .



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Best conditioned polynomials.

So, for many polynomials,  $\mu(f) \leq N$ . Can we find one f with that property? **not easy!** even changing N to  $N^c$ , c a constant.

#### Theorem (Shub–Smale)

Let  $x_1, \ldots, x_N \in \mathbb{S}$  satisfy  $\mathcal{E}(X) \leq m_N + c \log N$ . Let  $z_1, \ldots, z_N \in \mathbb{C}$  be the preimage of  $x_1, \ldots, x_N$  under the stereographic projection. Let f be the polynomial which has zeros  $z_1, \ldots, z_N$ .

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$$\mu(f) \leq N^{c+1}$$

Experiments suggest, for c = 0,  $\mu(f) \approx \sqrt{N}/2$ .

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Best conditioned polynomials

What about a reciprocal?

Theorem (B. 2014)

Let  $x_1, \ldots, x_N \in \mathbb{S}$ . Let  $z_1, \ldots, z_N \in \mathbb{C}$  be the preimage of  $x_1, \ldots, x_N$  under the stereographic projection. Let f be the polynomial which has zeros  $z_1, \ldots, z_N$ . Assume that  $\mu(f, z_i) \leq c$  for all i.

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Best conditioned polynomials

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$$\mathcal{E}(X) \leq \frac{N^2 \log N}{2} + \frac{N^2}{2} \log c + O(N^2) = O(m_N \log N).$$

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Experiments suggest, for c=1,  $\mathcal{E}(X)pprox m_N=N^2/4+\cdots$  .

Condition numbers for eigenvalue and eigenvector computations

For the eigenvalue it is a classical. For the eigenvector at least since Stewart (1971). Recently revisited by Armentano. Assume  $Av = \lambda v$ .

$$\begin{split} \kappa_{\lambda}(A,\lambda,v) &= \frac{1}{\text{Angle between right and left eigenvector}}\\ \kappa_{v}(A,\lambda,v) &= \|A\|_{F} \|B^{-1}\|, \end{split}$$
 where  $B = \pi_{v^{\perp}}(A - \lambda I) \mid_{v^{\perp}}$ 

[Armentano 2013]: Geometric context.  $\kappa_{\lambda} \leq constant \times \kappa_{\nu}$ .

Computing eigenvectors is polynomial time on the average

#### Theorem (Armentano, B., Burgisser, Cucker, Shub)

A homotopy algorithm can compute approximations a la Smale of eigenvalues-eigenvectors on Gaussian matrices in average polynomial time  $O(n^{7+2c})$ , where c is an upper bound on the condition number of the eigenvectors of the initial matrix of the homotopy.

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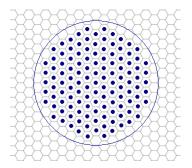
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Currently: c=1 (next slice) hence average time  $O(n^9)$ . Can we do better?

Previous result for Hermitian matrices by Armentano and Cucker with randomized algorithm.

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A diagonal matrix with optimal condition number

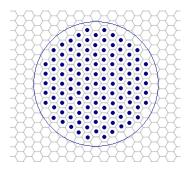


Fix n. Take a radius r enough to put n hexagons of fixed side 1 in the circle of radius r. The diagonal matrix with entries given by the complex coordinates of the blue dots is at most:



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A diagonal matrix with optimal condition number

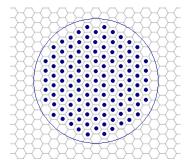


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Which is the **actual best?** Packing problem! Concrete relation to elliptic Fekete points?

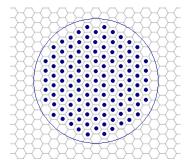
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Does this collection of points solve the original problem by Shub and Smale (find a sequence of well-conditioned polynomials)?

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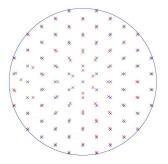
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(4月) (1日) (日)

#### Ongoing work

- Understanding the relation between the logarithmic energy and the condition number of polynomials and eigenvectors.
- Investigating the structure of the critical set of  $\mathcal{E}$ .
- Juan González Criado del Rey: investigating the topological properties of the set of minimizers of Tammes problem, which might give some insight in the dynamical formation of those pollen grains.

#### Japanese art and spherical points

Thank you for your attention.



