

# Some numerical aspects in spectral partitioning problems

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# Outline

- Objective: numerical analysis of some spectral shape optimization problems for boundary eigenvalue problems (eg. Steklov, Wentzell)
- Challenge: accurate vs fast!

Problems:

- Steklov spectrum;
- Laplace-Beltrami spectrum: optimal partitions on manifolds.

For  $\Omega \subset \mathbb{R}^2$ , regular enough, simply connected, we consider

$$\begin{cases} -\Delta u = 0 & \text{in } \Omega, \\ \frac{\partial u}{\partial n} = \sigma u & \text{on } \partial\Omega, \end{cases}$$

Steklov eigenvalues:

$$0 = \sigma_0 \leq \sigma_1(\Omega) \leq \sigma_2(\Omega) \leq \sigma_3(\Omega) \leq \dots \rightarrow +\infty$$

Variational characterization:

$$\sigma_n(\Omega) = \inf_{S_n} \sup_{u \in S_n \setminus \{0\}} \frac{\int_{\Omega} |\nabla u|^2 dx}{\int_{\partial\Omega} u^2 d\sigma}, \quad n = 1, 2, \dots$$

$$S_n \subset H^1(\Omega) \cap \left\{ \int_{\partial\Omega} u = 0 \right\};$$

$$\sigma_k(t\Omega) = \frac{1}{t} \sigma_k(\Omega).$$

$$\max_{\mathcal{A}} F(\sigma_1, \dots, \sigma_k)$$

- $F$  continuous and increasing in every variable;
- $\mathcal{A}$  - constraints: area/perimeter/convexity;

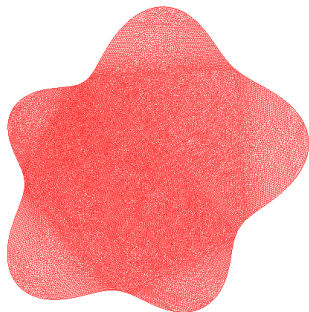
Example :  $\max_{|\Omega|=1} \sigma_k(\Omega), \min_{\text{Per}(\Omega)=1} \sum_{l=1}^k \frac{1}{\sigma_l(\Omega)}$

## Existence results

- Fixed volume + convexity (B.)
- Fixed volume, relaxed formulation (Bucur, Giacomini)

# Numerical computation of the Steklov spectrum

FreeFem++ - mesh-based method. For high precision we need many points



Can we be more accurate, use less discretization points and have huge speed improvements?

# Fundamental solutions method

"trick"

Work only with functions which solve the PDE exactly in  $\Omega$ .

- $(y_i)_{i=1}^N$  - the family of points in the exterior of  $\Omega$ ;
- $\phi_i$  - harmonic radial functions centered at  $y_i$ ;

$\Rightarrow$  every linear combination

$$u = \alpha_1 \phi_1 + \dots + \alpha_N \phi_N$$

is harmonic in  $\Omega$ .

# Boundary conditions

⇒ "arrange"  $(\alpha_i)$  such that

$$\frac{\partial u}{\partial n} \approx \sigma u \text{ on } \partial\Omega.$$

- $(x_i)_{i=1}^N$  - a discretization of  $\partial\Omega$ ;
- impose boundary conditions at  $(x_i)$ :

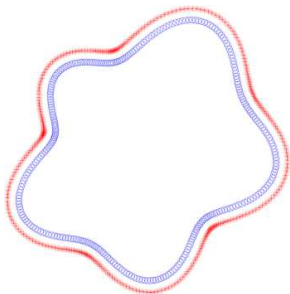
$$\alpha_1 \frac{\partial \phi_1}{\partial n}(x_i) + \dots + \alpha_N \frac{\partial \phi_N}{\partial n}(x_i) =$$
$$\sigma(\alpha_1 \phi_1(x_i) + \dots + \alpha_N \phi_N(x_i)), \quad i = 1 \dots N$$

- $\phi_j(x) = \log |x - y_j|$  (analytic formulas) ;
- $A = (\partial_n \phi_j(x_i))_{ij}^N, B = (\phi_j(x_i))_{ij}^N, u = (\alpha_1, \dots, \alpha_N)^T$  ;
- the problem becomes  $A\vec{\alpha} = \sigma B\vec{\alpha}$  ;
- generalized eigenvalue problem : eigs (Matlab)



# Choice of centers!

- $(x_i)$  are chosen in a uniform way on  $\partial\Omega$  (angles or arclength);
- $(y_i)$  are chosen on the normals in  $(x_i)$  to  $\partial\Omega$  at distance 0.1 of  $(x_i)$ .



# Comparaison FreeFem++

		FreeFem++			
$k$	MFS	2096▲	33788▲	134898▲	211290▲
1	0.712751	0.714888	0.712886	0.712785	0.712773
2	0.940247	0.942837	0.940411	0.940288	0.940274
3	1.381278	1.38874	1.38175	1.3814	1.38135
4	1.443204	1.45137	1.44372	1.44333	1.44329
5	3.146037	3.15592	3.14665	3.14619	3.14614
6	3.443637	3.45562	3.44438	3.44382	3.44376
7	3.757833	3.78642	3.75962	3.75828	3.75812
8	3.922822	3.95461	3.92478	3.92331	3.92313
9	4.274362	4.32906	4.27774	4.27521	4.2749
10	4.693207	4.75819	4.69723	4.69422	4.69385

# Error estimate

- the error seems to be small: quantification ?
- Adaptation of a result of Moler and Payne :

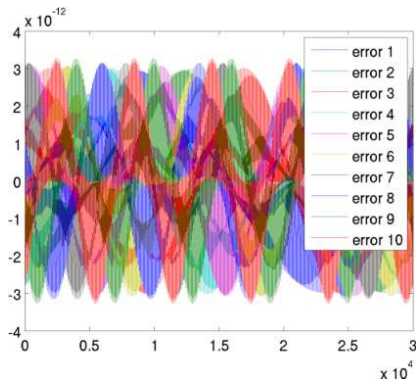
Let  $\Omega$  be bounded, regular, which satisfies

$$\begin{cases} -\Delta u_\varepsilon = 0 & \text{in } \Omega \\ \frac{\partial u_\varepsilon}{\partial n} = \sigma_\varepsilon u_\varepsilon + f_\varepsilon & \text{on } \partial\Omega. \end{cases}$$

with  $\|u_\varepsilon\|_{L^2(\partial\Omega)} = 1$  and  $\|f_\varepsilon\|_{L^2(\partial\Omega)} = \delta$  small. Then it exists a rank  $k \in \mathbb{N}^*$  such that

$$\frac{|\sigma_\varepsilon - \sigma_k|}{\sigma_k} \leq C \|f_\varepsilon\|_{L^2(\Omega)}.$$

- the unit disk : theoretical prediction :  $10^{-12}$ .

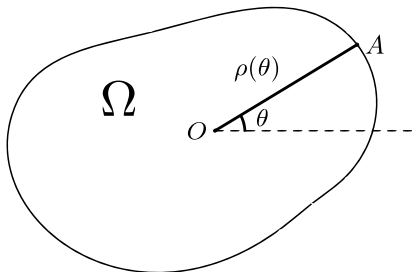


Numerical precision :  $10^{-12}$ .

- in general  $\|\partial_n u_{\text{num}} - \sigma_{\text{num}} u_{\text{num}}\|_{L^\infty} = O(10^{-6})$   
 $\Rightarrow$  precision of order  $10^{-6}$ .

# Star shaped sets

$$\Omega \longrightarrow \rho : [0, 2\pi) \rightarrow \mathbb{R}_+.$$



not too restrictive. To be explained later...

# Shape derivative - radial case

$$\rho(\theta) \approx a_0 + \sum_{i=1}^m a_i \cos(i\theta) + \sum_{i=1}^m b_i \sin(i\theta).$$

Dambrine, Kateb, Lamboley, *An extremal eigenvalue problem for the Wentzell-Laplace operator*, Section E

$$\frac{\partial \sigma_k}{\partial a_i} = \int_0^{2\pi} (|\nabla u(\rho(\theta)\vec{r}(\theta))|^2 - (2\sigma_k^2 + \sigma_k \mathcal{H}) |u(\rho(\theta)\vec{r}(\theta))^2| \rho(\theta) \cos(i\theta) d\theta$$

$$\frac{\partial \sigma_k}{\partial b_i} = \int_0^{2\pi} (|\nabla u_k(\rho(\theta)\vec{r}(\theta))|^2 - (2\sigma_k^2 + \sigma_k \mathcal{H}) |u_k(\rho(\theta)\vec{r}(\theta))^2| \rho(\theta) \sin(i\theta) d\theta.$$

# Numerical optimization tests

- Weinstock, Hersch-Payne

- $\min \sum_{i=1}^n \frac{1}{\sigma_i(\Omega)|\Omega|^{\frac{1}{2}}}$  realized by the disk

- $\min \sum_{i=1}^n \frac{1}{\sigma_{2i-1}(\Omega)\sigma_{2i}(\Omega)|\Omega|}$  realized by the disk

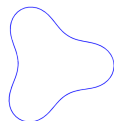
- $\max |\Omega|^{\frac{n}{2}} \prod_{i=1}^n \sigma_i(\Omega)$  realized by the disk

- $\min \sum_{i \in A} \frac{1}{\sigma_i(\Omega)|\Omega|^{\frac{1}{2}}}$  realized by the disk, where  $A$  has the property :  $1 \in A, 2k \in A \Rightarrow 2k - 1 \in A$ .

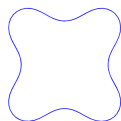
# Steklov - area constraint



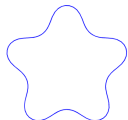
$$\sigma_2 = 2.91$$



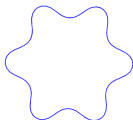
$$\sigma_3 = 4.14$$



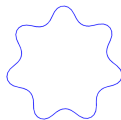
$$\sigma_4 = 5.28$$



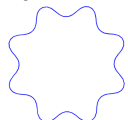
$$\sigma_5 = 6.49$$



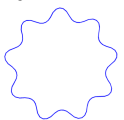
$$\sigma_6 = 7.64$$



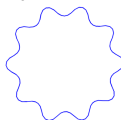
$$\sigma_7 = 8.84$$



$$\sigma_8 = 10.00$$



$$\sigma_9 = 11.19$$

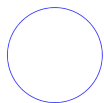


$$\sigma_{10} = 12.35$$

Figure : Shapes which maximize the  $k$ -th Steklov eigenvalue under area constraint,  $k = 2, 3, \dots, 10$ .



# Steklov - area constraint + convexity



$$\sigma_1 = 1$$



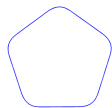
$$\sigma_2 = 2.87$$



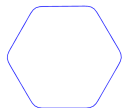
$$\sigma_3 = 3.86$$



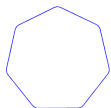
$$\sigma_4 = 4.56$$



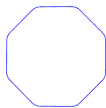
$$\sigma_5 = 5.61$$



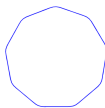
$$\sigma_6 = 6.24$$



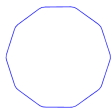
$$\sigma_7 = 7.43$$



$$\sigma_8 = 7.99$$



$$\sigma_9 = 9.15$$



$$\sigma_{10} = 9.75$$

Figure : Convex shapes with unit area which give highest  $k$ -th Steklov eigenvalue in our numerical observations





















# Wentzell problem

$$\begin{cases} -\Delta u = 0 & \text{dans } \Omega, \\ -\beta \Delta_\tau u + \partial u_n = \sigma u & \text{sur } \partial\Omega. \end{cases}$$

- $\Delta_\tau$  is the Laplace-Beltrami operator;
- adapt method fundamental solutions;
- use the formula:  $\Delta u = \Delta_\tau u + \mathcal{H} \frac{\partial u}{\partial n} + \frac{\partial^2 u}{\partial n^2}$ .
- change the boundary condition

$$\sum \alpha_j [(\beta \mathcal{H} + 1) \partial_n \phi_j + \beta \partial_n^2 \phi_j] = \sigma \sum \alpha_j \phi_j.$$

# Numerical results - Wentzell

	$\lambda_1$	$\lambda_2$	$\lambda_3$	$\lambda_4$	$\lambda_5$
$\beta = 0$					
$\beta = 0.1$					
$\beta = 0.5$					
$\beta = 100$					

# Laplace-Beltrami spectrum

Objective: study the partitions  $(\Omega_i)_{i=1}^n$  of  $\mathbb{S}^2$  :

$$\min(\lambda_1^{LB}(\Omega_1) + \dots + \lambda_1^{LB}(\Omega_n)).$$

## Motivation

- verify theoretical conjectures

# Fundamental solutions approach

$$\begin{cases} -\Delta_\tau u &= \sigma u & \text{on } \mathbb{S}^2 \\ \Delta u &= 0 & \text{in } B_1 \end{cases}.$$

We use again the decomposition

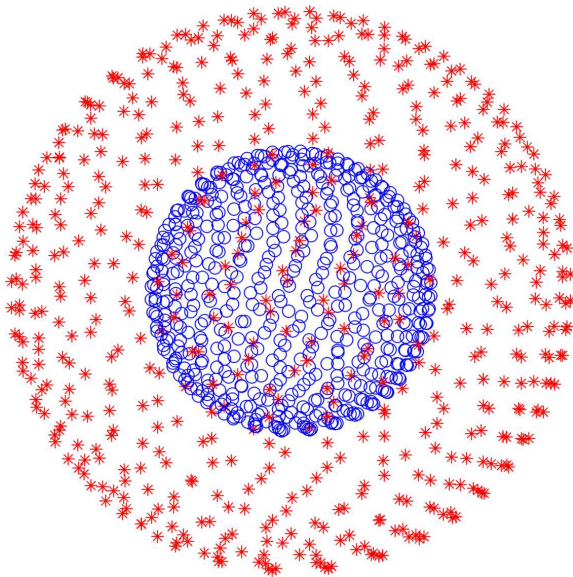
$$\Delta u = \Delta_\tau u + \mathcal{H} \frac{\partial u}{\partial n} + \frac{\partial^2 u}{\partial n^2},$$

where  $\frac{\partial^2 u}{\partial n^2} = (D^2 u \cdot n) \cdot n$ .

- Fundamental solutions:  $\phi_j(x) = 1/|x - y_j|$ .
- Boundary condition:

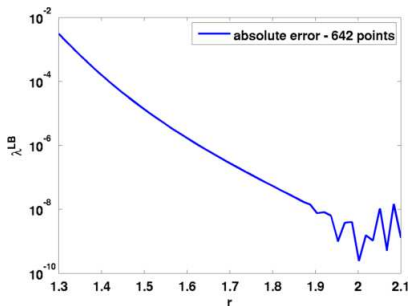
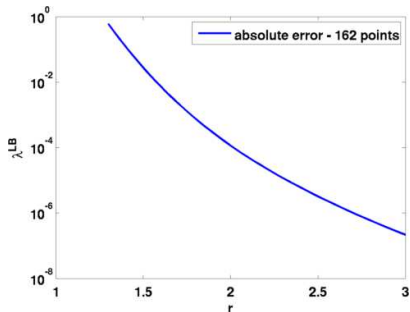
$$\sum \alpha_j \left( \mathcal{H} \frac{\partial \phi_j}{\partial n} + \frac{\partial^2 \phi_j}{\partial n^2} \right) = \sigma \sum \alpha_j \phi_j$$

# Example source/evaluation points



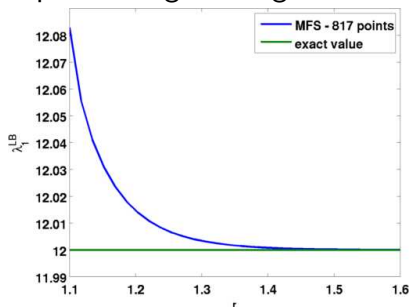
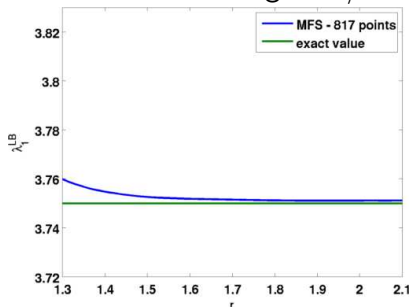
# Precision ?

- depends on  $r$  (distance between source points and the sphere) and the number of points



# Other examples

- vertical slice of angle  $2\pi/3$  or triple rectangle triangle



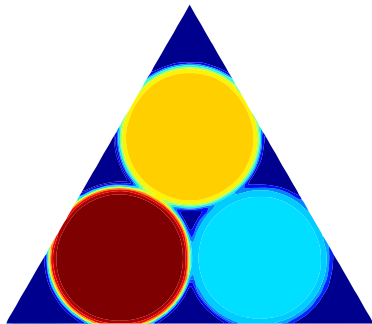
What to do for general subsets of the sphere?



# Penalized formulation

$$-\Delta_{\tau} u + C(1 - \varphi)u = \sigma u \text{ on } \mathbb{S}^2$$

- Method used by Bourdin, Bucur, Oudet in order to study numerically spectral optimal partitions in the plane;
- Bogosel, Velichkov, multiphase problem



# Discretization

- sphere mesh: evaluation points  $(x_i)$  ;
- discrete problem:

$$(K + C\text{diag}(1 - \varphi)M)u = \sigma Mu,$$

- $K$ : matrix containing the Beltrami terms

$$\left(\mathcal{H}\frac{\partial\phi_j}{\partial n} + \frac{\partial^2\phi_j}{\partial n^2}\right)(x_i)$$

- $M$ : matrix containing the values of the fundamental solution functions  $\phi_j(x_i)$ .
- $\varphi \in [0, 1]^N$ : the density approximating  $\Omega$ .

# Condition + projection

- Partitioning condition

$$\varphi_1 + \dots + \varphi_n = \mathbf{1}.$$

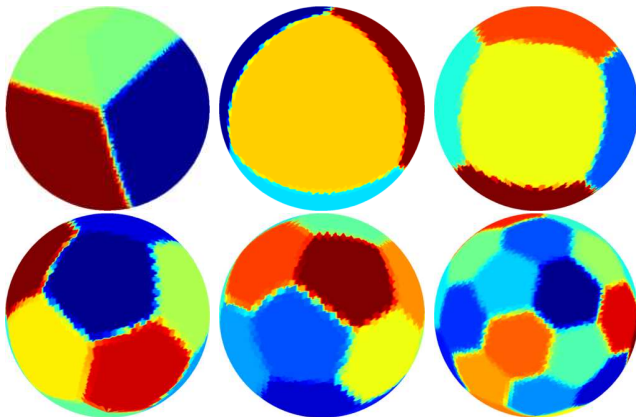
- Projection on the constraint

$$\Pi(\varphi)_{i=1}^n = \left( \frac{|\varphi_i|}{\sum_{j=1}^n |\varphi_j|} \right)_{i=1}^n.$$

# Optimization results

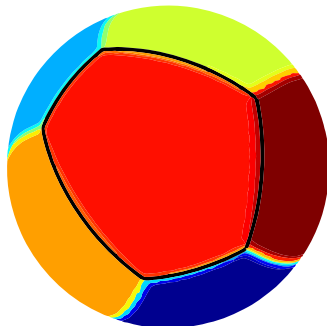
- Elliott, Ranner (2014) :  $n \in \{3, 4, 5, 6, 7, 8, 16, 32\}$ .
- Bogosel (2015) :  $n \in \{3, 4, 5, \dots, 24, 32\}$ .
- for  $n \leq 16$  fundamental solutions;
- for  $n > 16$  finite element method;

# Density results



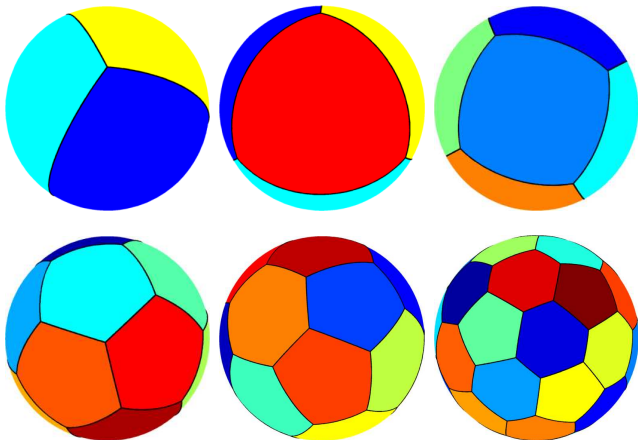
# Geodesic arcs

- The partition cells seem to be geodesic polygons;



- Elliott and Ranner observed the same behaviour.

# Refined optimization

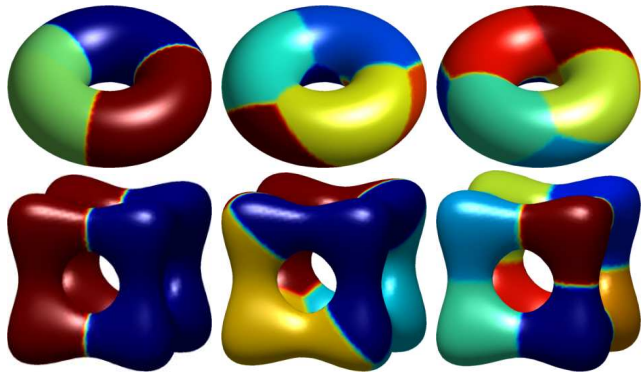


# Some remarks

- in general we have the same results as Elliott and Ranner
- for  $n = 16$  we have 4 equal hexagons et 12 equal pentagons (plausible; symmetric structure)
- we observe the same structure as the partitions in equal area cells which minimize the sum of perimeters (Cox-Fikkema)



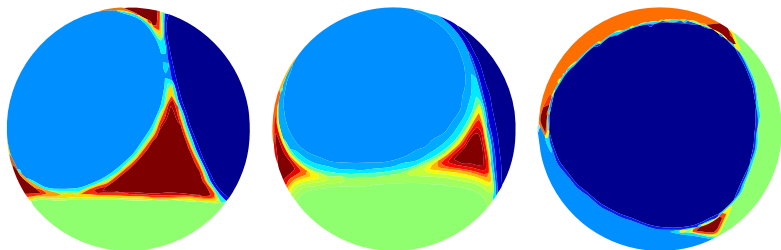
# Other shapes



# Variations

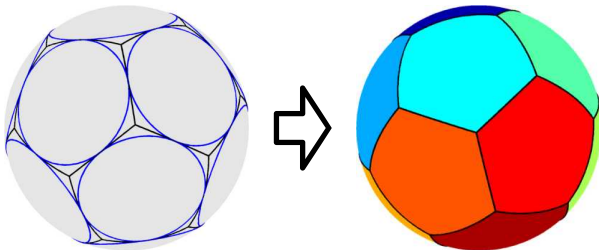
Multiphase problems on surfaces.

$$\min \sum_{i=1}^n (\lambda_1^{LB}(\Omega_i) + \alpha \text{Area}(\Omega_i)).$$



# Open questions

- which are the optimal partitions for  $n = 3, 4, 6, 12$ ?  
Conjecture : regular partitions;
- is it true that the partition cells are geodesic polygons?
- can we connect the "circle packing" on the sphere to the spectral partitioning problem, via the multiphase problem?



Thank you!