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Bempp-cl: A fast Python based just-in-time compiling boundary element library.

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Summary

The boundary element method (BEM) is a numerical method for approximating the solution of certain types of partial differential equations (PDEs) in homogeneous bounded or unbounded domains. The method finds an approximation by discretising a boundary integral equation that can be derived from the PDE. The mathematical background of BEM is covered in, for example, Steinbach (2008) or McLean (2000). Typical applications of BEM include electrostatic problems, and acoustic and electromagnetic scattering.

Bempp-cl is an open-source boundary element method library that can be used to assemble all the standard integral kernels for Laplace, Helmholtz, modified Helmholtz, and Maxwell problems. The library has a user-friendly Python interface that allows the user to use BEM to solve a variety of problems, including problems in electrostatics, acoustics and electromagnetics.

Bempp-cl began life as BEM++, and was a Python library with a C++ computational core. The ++ slowly changed into pp as functionality gradually moved from C++ to Python with only a few core routines remaining in C++. Bempp-cl is the culmination of efforts to fully move to Python, and is an almost complete rewrite of Bempp.

For each of the applications mentioned above, the boundary element method involves approximating the solution of a partial differential equation (Laplace's equation, the Helmholtz equation, and Maxwell's equations respectively) by writing the problem in boundary integral form, then discretising. For example, we could calculate the scattered field due to an electromagnetic wave colliding with a series of screens by solving

$$\begin{aligned} \nabla \times \nabla \times \mathbf{E} - k^2 \mathbf{E} &= 0, \\ \boldsymbol{\nu} \times \mathbf{E} &= 0 \text{ on the screens,} \end{aligned}$$

where $\mathbf{E}$ is the sum of a scattered field $\mathbf{E}^{\text{s}}$ and an incident field $\mathbf{E}^{\text{inc}}$, and $\boldsymbol{\nu}$ is the direction normal to the screen. (Additionally, we must impose the Silver–Müller radiation condition to ensure that the problem has a unique solution.) This problem is solved, and the full method is derived, in one of the tutorials available on the Bempp website (Betcke & Scroggs, 2020a). The solution to this problem is shown below.

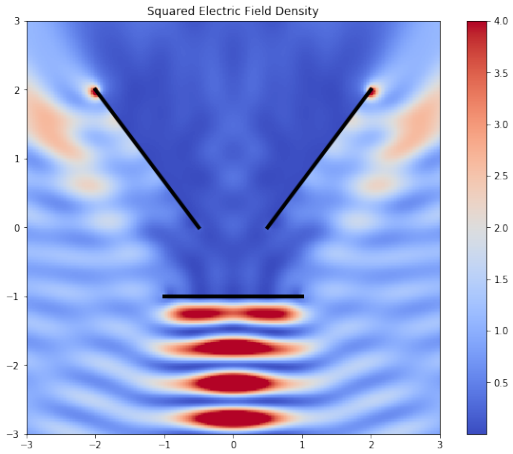

Figure 1: An electromagnetic wave scattering off three screens.

Statement of need

Bempp-cl provides a comprehensive collection of routines for the assembly of boundary integral operators to solve a wide range of relevant application problems. It contains an operator algebra that allows a straight-forward implementation of complex operator preconditioned systems of boundary integral equations (Betcke et al., 2020) and in particular implements everything that is required for Calderón preconditioned Maxwell (Scroggs et al., 2017) problems. Bempp-cl uses PyOpenCL (Klöckner et al., 2012) to just-in-time compile its computational kernels on a wide range of CPU and GPU devices and modern architectures. Alternatively, a fallback Numba implementation is provided.

OpenCL is used as it is able to compile C-based kernels to run on a wide range of CPU and GPU devices, without the need to write device specific code. Numba is offered as an alternative as it is easily available on all platforms and provides a version of the library that is significantly faster than using pure Python.

Bempp-cl is aimed at those interested in using boundary element method to solve problems, particularly those from a mathematical background. The syntax of the library is designed to closely resemble the boundary integral representation of the problem being solved, making the implementation of a problem simple once this representation is known.

There are only a small number of alternative boundary element method softwares available. The most popular is BETL (Hiptmair & Kielhorn, n.d.), a C++ template library that is available for free for academic use only. As a Python library, Bempp-cl is easier to interface with other popular libraries with Python interfaces—for example, is can be used alongside the finite element method library FEniCS (Logg et al., 2012) to solve coupled finite and boundary element problems (Betcke & Scroggs, 2021 (accessed 18 February 2021)). Bempp-cl also benefits from being fully open source library and available under an MIT license. A number of other libraries exist designed for specific applications, such as PyGBe for biomolecular electrostatics (Cooper et al., 2016) and abem for acoustics (Jargstorff, n.d.). Bempp-cl can be used for a much wider range of problems than these specialised libraries.

An overview of Bempp features

Bempp-cl is divided into two parts: `bempp.api` and `bempp.core`. The user interface of the library is contained in `bempp.api`. The core assembly routines of the library are contained in

`bempp.core`. The majority of users of Bempp-cl are unlikely to need to directly interact with the functionality in `bempp.core`.

There are five main steps that are commonly taken when solving a problem with BEM:

1. First a surface grid (or mesh) must be created on which to solve the problem.
2. Finite dimensional function spaces are defined on this grid.
3. Boundary integral operators acting on the function spaces are defined.
4. The operators are discretised and the resulting linear systems solved.
5. Domain potentials and far field operators can be used to evaluate the solution away from the boundary.

Bempp-cl provides routines that implement each of these steps.

Grid Interface

The submodule `bempp.api.shapes` contains the definitions of a number of shapes. From these, grids with various element sizes can be created internally using Gmsh (Geuzaine & Remacle, 2009). Alternatively, meshes can be imported from many formats using the meshio library (Schlömer & contributors, n.d.). Bempp-cl currently only supports flat triangle based surface meshes. Higher-order triangular meshes may be supported in the future.

Function Spaces

Bempp-cl provides piecewise constant and piecewise linear (continuous and discontinuous) function spaces for solving scalar problems. For Maxwell problems, Bempp-cl can create Rao–Wilton–Glisson (Rao et al., 1982) div-conforming spaces and Nédélec (Nédélec, 1980) curl-conforming spaces. In addition to these, Bempp-cl can also generate constant and linear spaces on the barycentric dual grid as well as Buffa–Christiansen div-conforming spaces, as described in Buffa & Christiansen (2007). These spaces can all be created using the `bempp.api.function_space` command.

Boundary operators

Boundary operators for Laplace, Helmholtz, modified Helmholtz and Maxwell problems can be found in the `bempp.api.operators.boundary` submodule, as well as sparse identity operators. For Laplace and Helmholtz problems, Bempp-cl can create single layer, double layer, adjoint double layer and hypersingular operators. For Maxwell problems, both electric field and magnetic field operators can be used.

Discretisation and solvers

Operators are assembled using OpenCL or Numba based dense assembly, or via interface to fast multipole methods. Internally, Bempp-cl uses PyOpenCL (Klöckner et al., 2012) to just-in-time compile its operator assembly routines on a wide range of CPU and GPU compute devices. On systems without OpenCL support, Numba (Lam et al., 2015) is used to just-in-time compile Python-based assembly kernels, giving a slower but still viable alternative to OpenCL.

Bempp-cl provides an interface to the Exafmm-t library (Wang et al., 2020) for faster assembly of larger problems with lower memory requirements using the fast multipole method (FMM).

The interface to Exafmm-t is written in a generic way so that other FMM libraries or alternative matrix compression techniques could be used in future.

The submodule `bempp.api.linalg` contains wrapped versions of SciPy's (Jones et al., 2001) LU, CG, and GMRes solvers. By using SciPy's `LinearOperator` interface, Bempp-cl's boundary operators can easily be used with other iterative solvers.

Potential and far field operators

Potential and far field operators for the evaluation at points in the domain or the asymptotic behavior at infinity are included in the `bempp.api.operators.potential` and `bempp.api.operators.far_field` submodules.

Further information

Full documentation of the library, including a number of example Jupyter notebooks, can be found online at `bempp.com` and in the in-development Bempp Handbook (Betcke & Scroggs, 2020b).

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