

Towards High-order Volume Potential Evaluation for Unstructured Meshes

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Introduction: Volume Potentials are Everywhere



What is an Integral Equation?

- ▶ Integral equations one way of solving PDEs, involve operations like solution of integral equations:

$$\int_{\Omega} K(\mathbf{x}, \mathbf{y}) \sigma(\mathbf{y}) d\mathbf{y} = f(\mathbf{x}) \quad (1)$$

(K is a kernel function and $\sigma(\mathbf{y})$ unknown)

- ▶ Or evaluation of integrals:

$$\phi(\mathbf{x}) = \int_{\Omega} K(\mathbf{x}, \mathbf{y}) \sigma(\mathbf{y}) d\mathbf{y} \quad (2)$$

- ▶ Central idea: solution of PDE sum of "fundamental solutions" G that solve PDE for point source (in the weak sense):

$$\mathcal{L}G(x, y) = \delta(y - x) \quad (3)$$

\mathcal{L} is linear differential operator associated with PDE, G the *Green's function*, δ Dirac delta.

How are They Useful?

- ▶ Example: Poisson equation:

$$\nabla^2 \phi = f \quad (4)$$

- ▶ Solution given by evaluating:

$$\phi(\mathbf{x}) = \int_{\Omega} G(\mathbf{x}, \mathbf{y}) f(\mathbf{y}) d\mathbf{y} \quad G(\mathbf{x}, \mathbf{y}) = \frac{1}{4\pi|\mathbf{x} - \mathbf{y}|} \quad (5)$$

- ▶ Integral equation methods evaluated with FMM competitive efficiency-wise with other approaches², and have excellent conditioning
- ▶ Evaluation of the integrals can pose challenges

Numerical Integral Evaluation

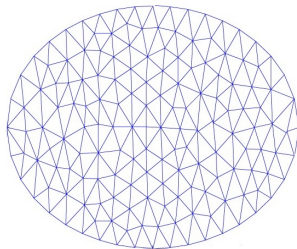
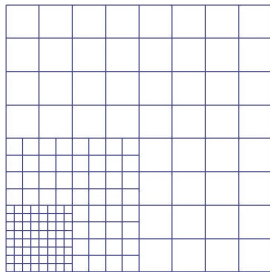
- ▶ Issue: Gaussian quadrature assumes integrand approximated well by polynomials
- ▶ Poor assumption since K is usually singular or near singular
- ▶ Consider common singularity, quadrature converges³ slowly:

$$y \in [-1, 1], \quad I(y) = \int_{-1}^1 |x - y|^{-\delta} dx, \quad |I - I_n| < \mathcal{O}(n^{-1+\delta}) \quad (6)$$

- ▶ Approaches include: product integration rules⁴; compute offline, weights that exactly integrate up to a polynomial order
- ▶ Transformation of the integral⁵(e.g. to a semi-infinite domain), causes singularity to vanish
- ▶ Adaptive quadrature; adaptively divide domain based on error estimate, compute on each subdomain

More General Scheme for Unstructured Meshes

- ▶ Mentioned approaches lack generality: tied to specific integrand and/or for unmapped/structured meshes
- ▶ We want a high-order general purpose quadrature method that works for unstructured meshes and complex geometries
- ▶ For inspiration look to QBX (Quadrature by Expansion)⁶: high-order, geometric flexibility

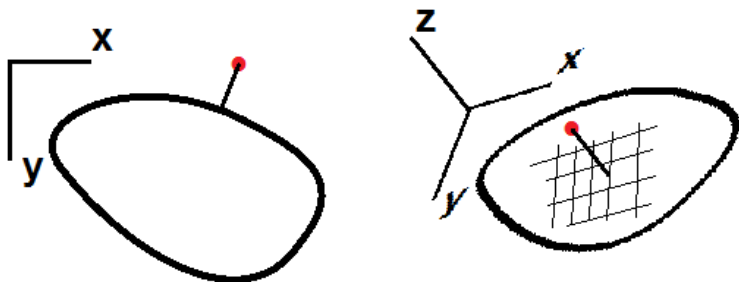


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Methodology: Approximations for Volume Potential Kernels

- ▶ Use QBX-like ideas: add smoothing parameter a in Green's function approximation \hat{G} , Taylor expand in a , evaluate back at target
- ▶ Call T_k the k -th order Taylor series expansion of \hat{G} about d and evaluate at $a = 0$:

$$T_k(r, d) = \sum_{n=0}^k \frac{(-d)^n}{n!} \hat{G}^{(n)}(r, d)$$

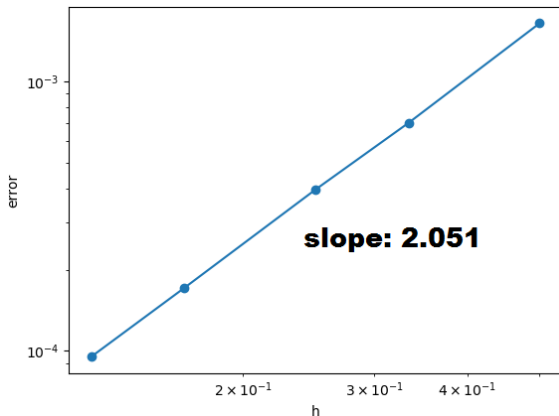


To Start: A Simple Choice for \hat{G}

- ▶ To start consider a simple smoothing scheme:
- ▶ 3D Poisson scheme: approximate $G = 1/r$ kernel with $\hat{G} = 1/\sqrt{r^2 + a^2}$
- ▶ Parameter a is the distance from expansion center to eval point in the fictitious dimension, and kernel is no longer singular
- ▶ Choose a “good” a so the kernel is smooth and evaluate Taylor expansion
- ▶ Our integrand is now smooth, and so we can use Gaussian quadrature

Is trial scheme high-order?

- ▶ No, in fact seems to be limited to second order regardless of expansion order.
- ▶ Consider example results in figure below for 6th order expansion.
- ▶ Why only second order?



Preliminary Error Analysis

- ▶ We would like to examine the error

$$\epsilon = |\text{Exact potential} - \text{QBX computed potential}| \quad (7)$$

and it's dependence on a

- ▶ So our error is:

$$\epsilon_k = \int_{\Omega} G(r)\sigma(r) dr - \int_{\Omega} T_k(r, d)\sigma(r) dr$$

- ▶ This form seems complicated to inspect, is there a way to avoid the integrals and factor out the density?

Error in Fourier Space

- Consider the action of the Fourier transform on the error:

$$\mathcal{F}[\epsilon] = \mathcal{F} \left[\int G \sigma \, dr \right] - \mathcal{F} \left[\int T_k \sigma \, dr \right]$$

and by the convolution theorem:

$$= \mathcal{F}[G] \mathcal{F}[\sigma] - \mathcal{F}[T_k] \mathcal{F}[\sigma] = \mathcal{F}[\sigma] (\mathcal{F}[G] - \mathcal{F}[T_k])$$

$$\mathcal{F}[T_k] = \sum_{n=0}^k \frac{(-d)^n}{n!} \mathcal{F}[\hat{G}^{(n)}(r, d)]$$

- More reasonable, examine the behavior of $\mathcal{F}[G] - \mathcal{F}[T_k]$ with respect to d .

Fourier Transform Particulars

- ▶ Need 3D Fourier transform; both G and T are radially symmetric, so simplifications can be made: transforms can be given in terms of the scalar k in Fourier space.
- ▶ It is known that $\mathcal{F}[1/r] = 1/\pi k^2$
- ▶ With some work one can show:

$$\mathcal{F}\left[\frac{1}{\sqrt{r^2 + a^2}}\right] = \frac{2a}{k} K_1(2\pi a k)$$

where $K_n(x)$ is the modified Bessel function of second kind

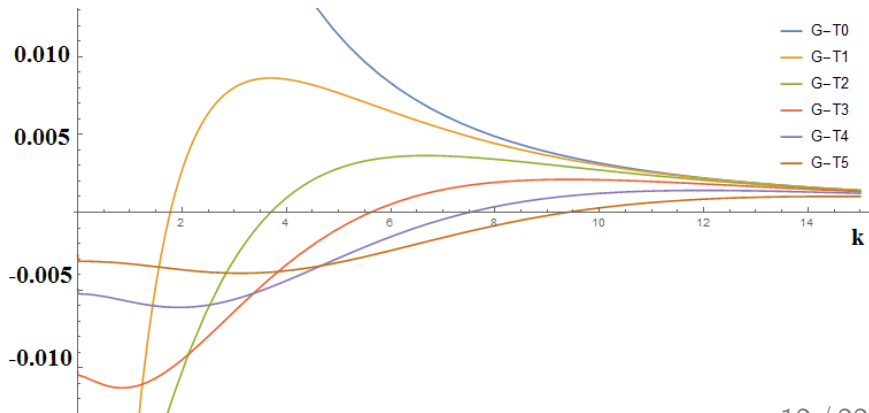
- ▶ Reduces to expected form for $\lim_{a \rightarrow 0} \frac{2a}{k} K_1(2\pi a k) = 1/\pi k^2$
- ▶ Without concerning ourselves with details, in general we find:

$$\mathcal{F}[T_k] = \sum_{n=-1}^k C_n d^{n+2} k^n K_n(2\pi k d)$$

Examination of Error

- ▶ k dependence tells us how well the expansion preserves low vs high modes in real space (in figure below $d = 0.2$)
- ▶ Taylor expansion of $\mathcal{F}[T_5]$ wrt d about 0:

$$\frac{1}{\pi k^2} + \frac{\pi d^2}{10} + \frac{1}{20}\pi^3 d^4 k^2 + \mathcal{O}(d^6)$$



Cause: Approximation Error

- ▶ It seems there is some additional approximation error that limits convergence, truncation error from Taylor series not the issue
- ▶ We replaced Green's function with de-singularized approximation, what does approximate kernel correspond to?
- ▶ Remember that for our Laplace equation

$$\nabla^2 G(x, y) = \delta(y - x) \quad (8)$$

- ▶ However our de-singularized Green's function doesn't satisfy this, instead of solving for a point source it solves for a blob source: ζ

$$\nabla^2 \hat{G}(x, y) = \zeta(y - x) \quad (9)$$

Dirac Delta Approximation and Moment Conditions

- ▶ The quality of our Green's function approximation then depends upon the quality of our Dirac delta approximation from our choice of a blob
- ▶ The order of convergence of this approximation can be shown^{8,9} to depend upon the *moment conditions*, where for a s order accurate approximation we require:

$$\int \zeta(\mathbf{x}) d\mathbf{x} = 1 \quad (10)$$

$$\int \mathbf{x}^{\mathbf{i}} \zeta(\mathbf{x}) d\mathbf{x} = 0, \quad |\mathbf{i}| < s - 1 \quad (11)$$

$$\int \mathbf{x}^s \zeta(\mathbf{x}) d\mathbf{x} < \infty \quad (12)$$

High Order De-singularized Kernels

- ▶ We can see that $1/\sqrt{r^2 + a^2}$ is actually 0th order approximation (the third condition isn't totally satisfied for $s = 2$)
- ▶ This approximation error in turn bounds our overall error and limits convergence rate to at best 2nd order
- ▶ Why better convergence than expected from kernel? Postulated QBX expansion satisfies moment conditions for $s = 2$, remains to be verified
- ▶ Possible to construct higher-order kernels by satisfying moment conditions¹⁰ for larger s
- ▶ For example consider the 2nd order kernel (i.e. satisfies moment conditions for $s = 2$):

$$\zeta = \frac{15/2}{(r^2 + a^2)^{7/2}} \rightarrow \hat{G} = \frac{r^2 + \frac{3}{2}a^2}{(r^2 + a^2)^{3/2}} \quad (13)$$

Fourier Space Error Analysis of High Order Kernels

- ▶ Define $T_{s,k}$ to be similar to our T_k from before, but now for \hat{G}_s the s th order algebraic approximate kernel
- ▶ We can examine again the error in our computed integral in Fourier space, but now for our higher order kernel
- ▶ We find that in general:

$$\mathcal{F}[T_{s,k}] = \frac{2}{(\frac{s}{2})!} d^n k^{n-2} \pi^{n-1} K_{\frac{s}{2}+1}(2\pi k d) + \sum_{n=\frac{s}{2}-1}^k C_n d^{n+2} k^n \pi^{n+1} K_n(2\pi k d) \quad (14)$$

- ▶ For example, consider the Taylor expansion of higher order kernels wrt d about 0:

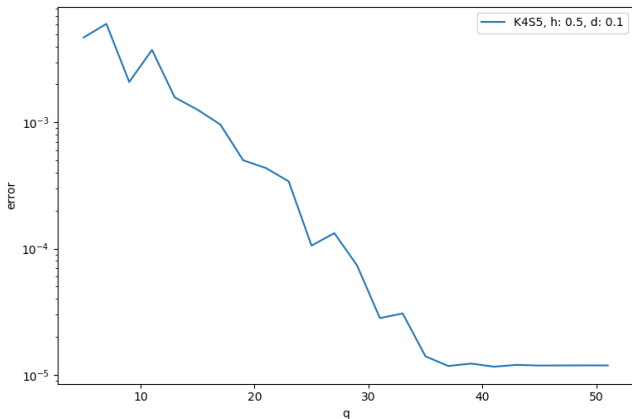
$$\mathcal{F}[T_{2,5}] \rightarrow \frac{1}{\pi k^2} + \frac{k^2 \pi^3 d^4}{20} + \mathcal{O}(d^6) , \quad \mathcal{F}[T_{4,7}] \rightarrow \frac{1}{\pi k^2} + \frac{k^4 \pi^5 d^6}{252} + \mathcal{O}(d^8)$$

Results: Test Setup

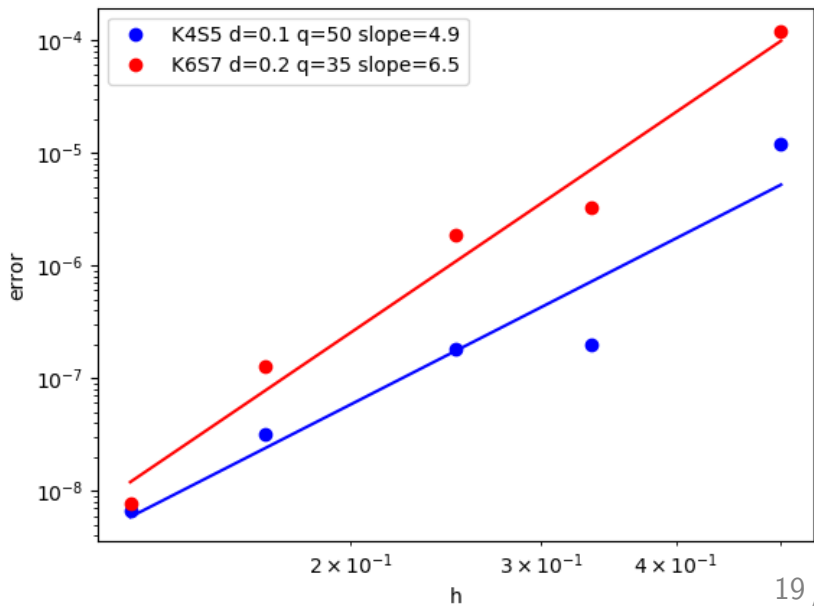
- ▶ Theoretical computed convergence rates were verified empirically
- ▶ Integral evaluated for 3D Laplace Green's function with constant density in domain $[-0.5, 0.5]^3$
- ▶ Possible to compute exact analytical expression for any target in domain
- ▶ Domain split into cube elements and tensor product Gauss-Legendre quadrature of varying order was used
- ▶ Computed result compared with exact result to determine error, and with h refinement the order of convergence

Required Minimum Quadrature Order

- ▶ Accuracy of result dependent on choice of quadrature order q and value chosen for d
- ▶ Min required quadrature order to accurately evaluate integral, smaller d less smooth kernel and higher required q
- ▶ Past min q , error dominated by truncation error in expansion



Observed Convergence



Next Steps: Quadrature Error Bounds

- ▶ We would like some way of bounding the quadrature error in our computed integral
- ▶ Several ways of finding such bounds¹¹ in terms of analytic continuability and total variation (TV)
- ▶ Total variation bound:

$$|I - I_n| = \frac{32}{15} \frac{V}{\pi^\nu (n - 2\nu - 1)^{2\nu+1}} \quad (15)$$

- ▶ where V is bounded variation of $f^{(\nu)}$
- ▶ Order of magnitude estimate at least provides useful metric for proportionality between d , q , and h

Conclusion

- ▶ High-order evaluation scheme for volume potentials on unstructured meshes in works
- ▶ Choice of smoothed kernel arbitrary, but important
- ▶ High-order convergence depends upon interplay between d , q , and h
- ▶ Still in development

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