## Fast boundary integral solvers for Stokes flows: quadrature, periodization, adaptivity

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Main collaborators in work shown:
Jun Wang (CCM), Ehssan Nazockdast (UNC) - rheology
Bowie Wu, Hai Zhu, Shravan Veerapaneni (UMich) - quadrature, adaptivity
L. Zhao (INTECH), G. Marple (UMich), SV - periodic no-slip
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## Rheology of spatially periodic suspensions

2D periodic mobility problem:
$\infty$ lattice of neutrally buoyant, smooth rigid bodies in Stokes fluid viscosity $\mu$
"non-Brownian" (i.e. not microscopic)
given shear rate $\gamma$, skewing unit cell
$\longmapsto \gamma$ applied shear rate


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What is bulk viscosity $\mu_{\text {eff }}:=\frac{\text { mean force/length }}{\gamma}$ ?
i) quasi-static $\mu_{\text {eff }}$ at current configuration
ii) evolution of $\mu_{\text {eff }}(t)$ as bodies move under flow statistical moments $\left\langle\mu_{\text {eff }}^{p}\right\rangle_{t}$, correlation decay in $t$, dependence on shape, vol. frac?
A homogenization problem. Applications:

- industrial processes, complex fluids (e.g. lattice of fibers into page), modeling non-periodic random suspensions, electro-rheology devices


## Motivations for sheared suspensions

PIV and dye imaging, 3D spheres
dia $\sim 2 \mathrm{~mm} \quad$ vol. frac. $\phi=0.35 \quad \operatorname{Re} \sim 10^{-4}$


(Souzy et al, '17)
observe: mixing, super-diffusion, turbulence, at $\operatorname{Re} \approx 0$
Questions:

- time-evolution, 2-pt correlations of bodies, mixing...
transport: "rolling-coating" effect needs accurate numerical flow near surfaces
- effect of $\phi$, validation of low- $\phi$ approx; shapes, jamming. . .
$\exists$ little accurate numerical simulation for general shapes
(even ellipses)
Goal: high-order solver, efficient, linear scaling w/ complexity in unit cell


## Non-periodic mobility problem

Recall: at $\mathbf{x}$ on surface $\mathbf{w} /$ normal $\mathbf{n}_{\mathbf{x}}$, traction $\mathbf{T}=\mathbf{T}(\mathbf{u}, p):=\sigma \cdot \mathbf{n}_{\mathbf{x}}$ where stress $\sigma(\mathbf{x}):=-p I+\mu\left(\nabla \mathbf{u}+(\nabla \mathbf{u})^{T}\right), \quad I$ means $2 \times 2$ id. matrix

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Given background Stokes flow $\left(\mathbf{u}_{0}, p_{0}\right)$, force- \& torque-free bodies $\Omega_{k}, k=1, \ldots, n$

Find ( $\mathbf{u}, p$ ) change from bkgnd, and
$\mathbf{v}_{k}, \omega_{k}$ body velocities \& rotation rates


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Find ( $\mathbf{u}, p$ ) change from bkgnd, and $\mathbf{v}_{k}, \omega_{k}$ body velocities \& rotation rates

BVP: exists a unique solution to...


$$
\begin{array}{rlrl}
-\mu \Delta \mathbf{u}+\nabla p & =\mathbf{0} & & \text { in } \Omega_{\text {ext }} \\
\nabla \cdot \mathbf{u} & =0 & & \text { fluid force balance } \\
\text { in } \Omega_{\mathrm{ext}} & \text { incompressible } \\
\mathbf{u}(\mathbf{x})+\mathbf{u}_{0}(\mathbf{x}) & =\mathbf{v}_{j}+\omega_{j}\left(\mathbf{x}-\mathbf{x}_{j}^{c}\right)^{\perp} & \mathbf{x} \in \Gamma_{k} \quad \text { rigid body motions }
\end{array}
$$

$$
\int_{\Gamma_{k}} \mathbf{T} d s=\mathbf{0} \quad \text { zero net fluid force on bodies } k=1, \ldots, n
$$

$\int_{\Gamma_{k}} \mathbf{T}(\mathbf{x}) \cdot\left(\mathbf{x}-\mathbf{x}_{k}^{c}\right)^{\perp} d s_{\mathbf{x}}=0 \quad$ zero net fluid torque, $k=1, \ldots, n$

$$
|\mathbf{u}(\mathbf{x})| \rightarrow 0 \quad|\mathbf{x}| \rightarrow \infty
$$

## Boundary integral equations (BIE) for mobility

$\mathrm{Re}=0$ (linear PDE) $\rightarrow$ BIE much more efficient than volume discr (FEM)
 2D (free space) vel. Green's func, $r:=x-y, r:=|r|$ $G(\mathbf{x}, \mathbf{y}):=\frac{1}{4 \pi \mu}\left(I \log \frac{1}{r}+\frac{\mathbf{r} \otimes \mathbf{r}}{r^{2}}\right)$ shown: $G(\mathbf{x}, \mathbf{y}) \cdot \mathbf{f}$ for some force vector $\mathbf{f}$

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Simplest case, one body $\Omega$ (bdry $\Gamma$ ):
single-layer vel. potential

$$
\begin{aligned}
& \mathbf{u}(\mathbf{x})=(\mathcal{S} \varphi)(\mathbf{x}):=\int_{\Gamma} G(\mathbf{x}, \mathbf{y}) \cdot \varphi(\mathbf{y}) d s_{\mathbf{y}} \\
& \text { force density "sprayed" onto } \Gamma ; \quad \exists \text { sim. pressure pot. } p(\mathrm{x})
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Simplest case, one body $\Omega$ (bdry $\Gamma$ ):
single-layer vel. potential
Combine 3 facts:
a) resulting $\mathbf{u}$ cont. \& $(\mathbf{u}, p)$ obeys Stokes both in $\Omega_{\text {ext }}$ and inside $\Omega$.
b) jump relations: on $\Gamma_{-}$(lim inside), $\mathbf{T}_{-}(\mathbf{u}, p)=\left(\left(\frac{1}{2} I+K\right) \varphi\right)(\mathbf{x})$
bdry integral operator $(K \varphi)(x):=-\frac{1}{\pi} \int_{\Gamma} \frac{\left(n_{x} \cdot r\right)(r \cdot \varphi(y))}{r^{4}} \mathbf{r} d s_{y} \quad$ " $\mathrm{n}_{\mathrm{x}} \cdot$ stresslet"
c) $\mathbf{T}\left(\mathbf{u}+\mathbf{u}_{0}, p+p_{0}\right) \equiv \mathbf{0}$ on $\Gamma_{-} \Rightarrow \mathbf{u}+\mathbf{u}_{0}$ rigid body motion

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Gives BIE on 「:
$\left(\frac{1}{2} I+K\right) \varphi=-\mathbf{T}\left(\mathbf{u}_{0}, p_{0}\right)$ with constraints:

$$
\int_{\Gamma} \varphi d s=\mathbf{0}
$$

$$
\int_{\Gamma}\left(\mathbf{x}-\mathbf{x}^{c}\right)^{\perp} \cdot \varphi(\mathbf{x}) d s_{\mathbf{x}}=0
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## Mobility BIE formulation. . (non-periodic)

But: BIE w/ 3 constraints $\left\{\begin{aligned}\left(\frac{1}{2} I+K\right) \varphi & =-\mathbf{T}\left(\mathbf{u}_{0}, p_{0}\right) \\ \int_{\Gamma} \varphi d s & =\mathbf{0} \\ \int_{\Gamma}\left(\mathbf{x}-\mathbf{x}^{c}\right)^{\perp} \cdot \varphi(\mathbf{x}) d s_{\mathrm{x}} & =0\end{aligned}\right.$ is equivalent to: BIE on $\Gamma \quad\left(\frac{1}{2} I+K+L\right) \boldsymbol{\varphi}=-\mathbf{T}\left(\mathbf{u}_{0}, p_{0}\right) \quad L=$ rank-3, applies constraints
(Karrila-Kim '89; Rachh-Greengard '16)
What about $n>1$ bodies $\Omega_{k}$ ? $\quad \varphi=\left\{\varphi_{k}\right\}_{k=1}^{n}, n \times n$ blocks $\left\{K_{k, k^{\prime}}\right\}, L$ block-diag.

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Nyström discretization (one body): $z(t), 2 \pi$-periodic global parameterization of $\Gamma$
 quadr. rule: $\int_{\Gamma} g d s \approx \sum_{j=1}^{N} w_{j} g\left(\mathbf{y}_{j}\right)$ nodes $\mathbf{y}_{j}=z\left(\frac{2 \pi j}{N}\right)$ weights $w_{j}=\frac{2 \pi}{N}\left|z^{\prime}\left(\frac{2 \pi j}{N}\right)\right|$

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- 「 smooth $\rightarrow$ kernels smooth $\rightarrow$ spectrally accurate $\quad$ (Anselone, Kress)
- 2nd-kind $\mathrm{BIE} \Rightarrow$ well-cond. $\Rightarrow$ rapid convergence of GMRES So, for $N \gtrsim 10^{3}$ use FMM to apply $A$ in iter. solver $\rightarrow$ scaling $\mathcal{O}(N)$


## Evaluating potentials close to source curve



Now have samples $\left\{\varphi\left(\mathbf{y}_{j}\right)\right\}_{j=1}^{N}$, how eval $\mathbf{u}(\mathbf{x})$ near $\Gamma$ ? Similarly, how fill matrix els. $K_{i j}$ between close curves? Naive: same quadr. rule $u(\mathbf{x}) \approx \sum_{j=1}^{N} w_{j} G\left(\mathbf{x}, \mathbf{y}_{j}\right) \cdot \varphi\left(\mathbf{y}_{j}\right)$ \# correct digits $\approx 2.7 \frac{\operatorname{dist}(x, \Gamma)}{h} \quad$ dist. $\lesssim h$ bad
Demo: naive potential eval. interior to curve $\Gamma$
$\log _{10}$ evaluation error in $\boldsymbol{u}$ due to quadrature with N nodes:


$\mathrm{N}=60$


Better: Stokes pots. in terms of Laplace pots, in terms of Cauchy ints...

## Beautiful quadrature idea: barycentric Cauchy in $\mathbb{C}$

 Interior potential task: given samples $v_{j}=v\left(y_{j}\right)$, eval. Cauchy $\quad v(x)=\frac{i}{2 \pi} \int_{\Gamma} \frac{v(y)}{x-y} d y, \quad x \in \Omega \subset \mathbb{C}$- plain quadr. rule fails close to $\Gamma$, as before



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Subtract the above from $v(x)$ times the special case $1=\frac{i}{2 \pi} \int_{\Gamma \frac{1}{x-y}} d y$ :

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0=\int_{\Gamma} \frac{v(x)-v(y)}{x-y} d y \quad \text { cancels singularity; integrand smooth even as } x \rightarrow \Gamma
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$$
0 \approx \sum_{j=1}^{N} \frac{v(x)-v_{j}}{x-y_{j}} w_{j}
$$

now rearrange...
Gives $\quad v(x) \approx \frac{\sum_{j=1}^{N} \frac{v_{j}}{x-y_{j}} w_{j}}{\sum_{j=1}^{N} \frac{1}{x-y_{j}} w_{j}}$ 2nd form barycentric interp, but complex nodes uniformly accurate in $\bar{\Omega}$, if nodes resolved $v$ on $\Gamma$ (loakimidis '91, Helsing '08)

- no such trick in 3D : ( $\exists$ schemes: radial patches, QBX, adaptive...


## Apply barycentric to 2D Stokes potentials

Built close-evaluation Stokes global quadratures on Laplace on Cauchy

- Cauchy enables double-layer; we generalized to single-layer Use close-eval. for mat. els. $K_{i j}$ and for flow eval:
(B-Wu-Veerapaneni '14)


ext. Stokes, no-slip BCs, SLP+DLP formulation, $n=20$ bodies, body separation $\delta \sim 10^{-4}$
- density $\varphi$ peak width $\mathcal{O}\left(\delta^{1 / 2}\right)$ (e.g. Sangani-Mo '94), good for $\delta \gtrsim h^{2}$
- for mobility prob: also traction of SLP (needs $v^{\prime \prime}$ ) (Wang-B, in prep.) github: ahbarnett/BIE2D, dstein/pyBIE2D
- for $\delta \rightarrow 0$, global quadr. scheme bad $\rightarrow$ need adaptive (later!)


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Two common ways to periodize (compatible with FMM to apply A):
A) Lattice sums $\approx$ Taylor coeffs of smooth sum $\left.\sum_{(m, n) \neq(0,0)} G(\mathbf{x}, \mathbf{y}+m, n)\right)$
(Rayleigh 1892; Hasimoto, Helsing, Greengard-Kropinski '04)
issues: - regularization: setting divergent sums to opaque values

- spherically symm. expansions $\rightarrow$ high aspect/skew, bad
B) Particle-Mesh Ewald
can be spectrally accurate (Lindbo-Tornberg '10, '11) split $G_{\text {per }}$ : local (spatial) + decaying in Fourier (spectral)
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We believe have simpler general approach fixing issues ...

## Periodize by solving BVP in one unit cell

Never think about sums! (technical, conditionally convergent, Ewald formulae...yuk) Just augment lin. sys. with BCs you'd like on walls of single unit cell:

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Never think about sums! (technical, conditionally convergent, Ewald formulae...yuk) Just augment lin. sys. with BCs you'd like on walls of single unit cell:
sum (FMM) only the near images:

proxy sources account for the rest:


Here $A$ is as before, but also sums nearby images to make proxies accurate Get "extended lin. sys:" $\left[\begin{array}{ll}A & B \\ C & Q\end{array}\right]\left[\begin{array}{c}\text { density } \varphi \\ \text { proxy strengths }\end{array}\right]=\left[\begin{array}{c}B C \text { on } \Gamma \\ \text { mismatch btw } 4 \text { walls }\end{array}\right]$ stable \& FMM-compat: tricky rank-2-pert. Schur compl. (B-Marple-Veerapaneni-Zhao '18)

- idea from Helmholtz (B-Greengard '10); implicit in (Larson-Higdon '80s)
- inspired cubical-unit-cell periodization of PVFMM
(Yan-Shelley '18)


## 2D porous medium Stokes flow

given pressure drop doubly-periodic shown: one unit cell
$n=10^{3}$
close-to-touching no-slip islands
error $10^{-8}$
1 day CPU

$$
2 N=7 \times 10^{5}
$$

(B-Marple-Veerapaneni-
Zhao '18)


## Back to periodic mobility: quasi-static BVP

Fix bkgnd shear flow $\mathbf{u}_{0}(\mathbf{x})=\left(\gamma x_{2}, 0\right)$ physical flow will be $\mathbf{u}_{0}+\mathbf{u}$ At time $t$ : find $\left\{\mathbf{v}_{k}, \omega_{k}\right\}$, and $(\mathbf{u}, p)$ periodic in current unit cell $\mathcal{U}(t)$, s.t.

$$
\begin{array}{rlr}
-\mu \Delta \mathbf{u}+\nabla p=\mathbf{0} & & \text { in } \mathcal{U} \backslash\left\{\overline{\Omega_{k}}\right\} \\
\nabla \cdot \mathbf{u}=0 & & \text { in } \mathcal{U} \backslash\left\{\overline{\Omega_{k}}\right\}
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$$

$$
\mathbf{u}(\mathbf{x})+\mathbf{u}_{0}(\mathbf{x})=\mathbf{v}_{j}+\omega_{j}\left(\mathbf{x}-\mathbf{x}_{j}^{c}\right)^{\perp} \quad \mathbf{x} \in \Gamma_{k} \quad \text { rigid body motions }
$$

$$
\int_{\Gamma_{k}} \mathbf{T} d s=\mathbf{0} \quad \text { zero net fluid force on bodies } k=1, \ldots, n
$$

$\int_{\Gamma_{k}} \mathbf{T}(\mathbf{x}) \cdot\left(\mathbf{x}-\mathbf{x}_{k}^{c}\right)^{\perp} d s_{\mathbf{x}}=0 \quad$ zero net fluid torque, $k=1, \ldots, n$

Then extract: $\quad \mu_{\text {eff }}(t)=\frac{1}{\gamma\left|\mathbf{e}_{1}\right|} \int_{\mathrm{D}} \mathbf{T}\left(\mathbf{u}_{0}+\mathbf{u}, p\right) \cdot \mathbf{t} d s$
horiz. force on bottom wall; avoids cell avg $\langle\sigma\rangle_{\mathcal{U}}$ of (Brady, etc)

## Other new ingredients

- $G_{\text {per }}$ issue: stokeslet force $\neq \mathbf{0}$, but periodic $\mathrm{BCs} \Rightarrow$ net traction $=\mathbf{0}$ Propose generalized $G_{\text {per }}^{\text {Neu }}(\mathbf{x}, \mathbf{y}):=\left[\mathbf{w}_{(1,0)}(\mathbf{x}), \mathbf{w}_{(0,1)}(\mathbf{x})\right]$, where $\mathbf{w}_{\mathbf{f}}$ solves:

$$
\begin{aligned}
-\mu \Delta \mathbf{w}+\nabla \boldsymbol{q} & =\mathbf{f} \delta_{\mathbf{y}} & & \text { in } \mathcal{U} \backslash\left\{\overline{\Omega_{k}}\right\} \\
\nabla \cdot \mathbf{w} & =0 & & \text { in } \mathcal{U} \backslash\left\{\overline{\Omega_{k}}\right\} \\
\mathbf{w}_{R}-\mathbf{w}_{L} & =\mathbf{0} & & \text { periodic } \\
\mathbf{T}(\mathbf{w}, q)_{R}-\mathbf{T}(\mathbf{w}, q)_{L} & =\mathbf{f} / 2\left|\mathbf{e}_{2}\right| & & \text { const leakage of net force } \\
\mathbf{w}_{U}-\mathbf{w}_{D} & =\mathbf{0} & & \text { periodic } \\
\mathbf{T}(\mathbf{w}, q)_{U}-\mathbf{T}(\mathbf{w}, q)_{D} & =\mathbf{f} / 2\left|\mathbf{e}_{1}\right| & & \text { const leakage of net force }
\end{aligned}
$$

unique up to consts; $\mathcal{S}_{\text {per }}^{\text {Neu }} \varphi$ not periodic unless $\int_{\Gamma} \varphi d s=0$

## Other new ingredients

- $G_{\text {per }}$ issue: stokeslet force $\neq \mathbf{0}$, but periodic $\mathrm{BCs} \Rightarrow$ net traction $=\mathbf{0}$ Propose generalized $G_{\text {per }}^{\text {Neu }}(\mathbf{x}, \mathbf{y}):=\left[\mathbf{w}_{(1,0)}(\mathbf{x}), \mathbf{w}_{(0,1)}(\mathbf{x})\right]$, where $\mathbf{w}_{\mathbf{f}}$ solves:

$$
\begin{aligned}
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\end{aligned}
$$

unique up to consts; $\mathcal{S}_{\text {per }}^{\text {Neu }} \varphi$ not periodic unless $\int_{\Gamma} \varphi d s=0 \quad$ "Neumann function"

- eval. traction of $G_{\text {per }}^{\text {Neu }}$ fast, gives a stable mat-vec for GMRES:

FMM for near images + correction of wall mismatch via cheap "empty unit cell" BVP "empty" BVP solved to $10^{-14}$ via method of fundamental solutions (proxy pts)

- kd-tree to find close targets needing special quadratures
- extract $\mu_{\text {eff }}$ via cheap far-field contour integral


## Results: quasi-static solve

$n=10^{2}$ bodies, close-touching pressure on the unit box, $N=100, n=350, T=154 s$

$2 \mathrm{~N}=7 \times 10^{4}$ unknowns, 2.5 mins
$n=10^{3}$ bodies, close-touching:
pressure on the unit box, $\mathrm{N}=1000, \mathrm{n}=350, \mathrm{~T}=53 \mathrm{~min}$

$2 \mathrm{~N}=7 \times 10^{5}$ unknowns, 1 hr

8-digit accuracy $\quad N=350$ per body typ. $<100$ GMRES iters.

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8-digit accuracy $\quad N=350$ per body typ. $<100$ GMRES iters.
Evolution: define body state vector $\mathbf{z}(t):=\left\{\mathbf{x}_{k}^{c}, \theta_{k}\right\} \in \mathbb{R}^{3 n}$ wrap the quasi-static solve as evaluating $\left\{\mathbf{v}_{k}, \omega_{k}\right\}=\frac{d \mathbf{z}}{d t}=\mathbf{F}(\mathbf{z}(t))$
autonomous ODE system
Feed to favorite $t$-stepper: fixed- $\Delta t$ Euler, or high-order adaptive

## Results: time-evolution

$n=25$ ellipses, run for 100 shear-times, apparently equilbrium...


- spatial solve error $10^{-10}$, evolution typ. $10^{-4} \sim 1 \mathrm{~s} /$ step, FMM+GMRES
- we can run fwd-Euler, or adaptive RK4 (slows down)
- add short-range repulsive force, needed for higher $\phi$; in progress


## Panel quadratures and adaptivity

To best handle arbitrary geometries: need composite quadr. rules


Gauss-Legendre
rule on each panel

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(Helsing '08, Ojala-Tornberg '15)

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- No-slip Stokes flow in 2D vascular network model:
(Wu-Zhu-B-Veerapaneni, in prep.)

adaptivity: panels split until resolve geom to user-requested tolerance $\varepsilon$ panel order $p \approx \log _{10}(1 / \epsilon)$


## Panel quadratures and adaptivity II

microfluidic device design: "worm clamps" plus nearby particles


- could factorize fixed walls via fast direct solver, cheap t-steps
(Marple-B-Gillman-Veerapaneni '16)


## Conclusions

Flavor of efficient \& accurate Stokes solvers, which need:

- special quadratures for close-evaluation
- new periodization tools for skewing unit cells
- adaptivity for complex devices

Numerical analysis philosophy: solve the actual BVP, to many digits
Software is harder, in progress at Flatiron for BIE in 2D, 3D (Stein/Yan (CCB), Racch/Greengard/B (CCM), O'Neil/Malhotra (NYU)...)

* Special issue of Adv. Comput. Math. on BIE, submissions due 8/31/20

Although I haven't yet modeled swimming fish ( $\operatorname{Re} \gg 1$ ), thanks Mike for help over the years and helping guide me into fun fluids!

## EXTRA SLIDES

## Jamming?

Two 4-pointed smooth stars per unit cell: jamming stars 1
jamming stars 2
jamming stars 3
(we don't understand jamming yet. . . )

Center for Computational

## Singly-periodic pipe with vesicles

Fast direct solver factorizes pipe solve once and for all, cheap to apply:


