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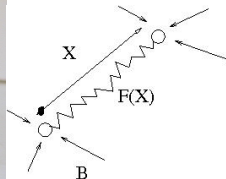
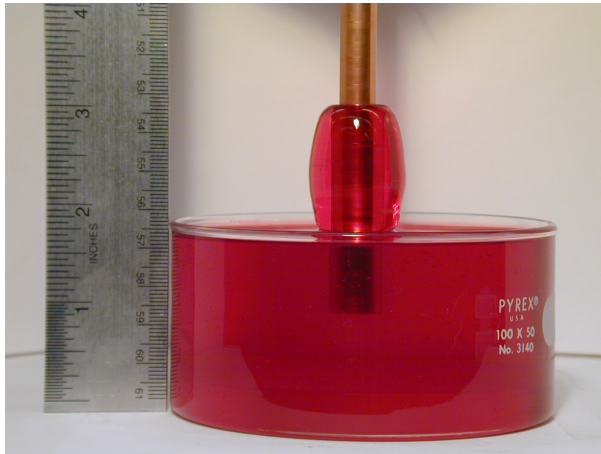


Outline

- 1 Introduction**
 - Motivation and goal
 - Position of the problem
- 2 Methodology**
 - Space discretization
 - Time discretization
- 3 Numerical tests**
- 4 Summary and bibliography**

Non-Newtonian Weissenberg effect

A viscoelastic liquid climbing along a rotating rod



Different modellings possible

- Multiscale physics: a zoo of micro-macro models.
Langevin formalism at the scale of polymer molecules.
Computations: expensive ! (embarrassingly parallel).
Analysis of hybrid methods: *topic for another talk !*
- Nonlinear rheology: a zoo of constitutive laws.
(Possibly obtained from micro-macro closures.)
Seems more accessible for industrial applications, but
numerical stability problems
(e.g. at high Weissenberg numbers).

Strategy

- We have *little mathematical understanding* of constitutive ([Renardy 1985], [Guillopé Saut 1990], [Lions Masmoudi 2000], [Fernandez-CaraGuillen Ortega 2002], [Barrett Süli 2007], [Lei Liu Zhou 2008]) or micro-macro ([Lions Masmoudi 2005], [Jourdain Le bris Lelièvre 2007] [Masmoudi 2010]) models, but when sol. is smooth, **long-time asymptotics** identified ([Jourdain Le Bris Lelièvre Otto 2006]).
- **Numerical stability** of const. laws ([Owens Philips 2002]) recently improved by comput. rheologists ([Hulsen Fattal Kupferman 2005]).
- \Rightarrow Can we build a **mathematical understanding** of the stability issue, **with numerical analysis tools**, based on free-energy estimates ([Jourdain Le Bris Lelièvre Otto 2006]) ?
- Numerical analyses for FD, FE, and FV schemes exist (consistency: [Baranger Machmoum 1997] [Baranger Sandri] ; stability: [Fortin Fortin] [Lozinski Owens 2003] [Lee Xu 2006]), but not for free-energy-dissipative schemes.



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Mathematical setting

A Cauchy-Dirichlet problem for the Oldroyd-B model

$$(P) \left\{ \begin{array}{l} \operatorname{Re} \left(\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} \right) = -\nabla p + (1 - \varepsilon) \Delta \mathbf{u} + \frac{\varepsilon}{\operatorname{Wi}} \operatorname{div} \boldsymbol{\sigma} \\ \operatorname{div} \mathbf{u} = 0 \\ \frac{\partial \boldsymbol{\sigma}}{\partial t} + (\mathbf{u} \cdot \nabla) \boldsymbol{\sigma} = (\nabla \mathbf{u}) \boldsymbol{\sigma} + \boldsymbol{\sigma} (\nabla \mathbf{u})^T - \frac{1}{\operatorname{Wi}} (\boldsymbol{\sigma} - I) \end{array} \right.$$

- Homogeneous Dirichlet B.C. $\mathbf{u} = 0$ (no flow on $\partial\mathcal{D}$)
+ smooth I.C. $\mathbf{u}(t = 0) = \mathbf{u}_0, \boldsymbol{\sigma}(t = 0) = \boldsymbol{\sigma}_0 \in \mathbb{R}_{SPD}^{d \times d}$:
local-in-time regular solutions [Guillope Saut ; Fernandez-Cara Guillen Ortega]
- If global-in-time solutions still regular, unique long-time behaviour: free-energy estimate + Gromwall lemma

Free energy for the Oldroyd-B model

Link with micro-macro models (Kramers)

$$d\mathbf{X}_t + (\mathbf{u} \cdot \nabla)\mathbf{X}_t dt = \left((\nabla \mathbf{u})\mathbf{X}_t - \frac{1}{2Wi} \mathbf{F}(\mathbf{X}_t) \right) dt + \frac{1}{\sqrt{Wi}} d\mathbf{B}_t$$

$$\boldsymbol{\sigma} = \frac{\varepsilon}{Wi} \mathbb{E} [\mathbf{X}_t \otimes \mathbf{F}(\mathbf{X}_t)] = \frac{\varepsilon}{Wi} \int [\mathbf{X} \otimes \mathbf{F}(\mathbf{X})] \psi_t(\mathbf{X}) d\mathbf{X}$$

- Statistical entropy with $\mathbf{F}(\mathbf{X}) = -\nabla \ln \psi_\infty(\mathbf{X})$ in micro

$$F(\mathbf{u}, \psi) = \frac{Re}{2} \int_D |\mathbf{u}|^2 + \frac{\varepsilon}{2Wi} \int_D \int \ln \left(\frac{\psi}{\psi_\infty} \right) \psi_\infty$$

[Jourdain Le Bris Lelièvre Otto] ARMA 181(1):97–148, 2006

- Oldroyd-B \Leftrightarrow Hookean micro $\mathbf{F}(\mathbf{X}) = H\mathbf{X}$; $\psi_\infty = e^{-\frac{H}{2}|\mathbf{X}|^2}$

$$F(\mathbf{u}, \boldsymbol{\sigma}) = \frac{Re}{2} \int_D |\mathbf{u}|^2 + \frac{\varepsilon}{2Wi} \int_D \text{tr}(\boldsymbol{\sigma} - \ln \boldsymbol{\sigma} - \mathbf{I})$$

[Hu Lelièvre] CMS 5(4):909–916, 2007. [Boyaval Lelièvre Mangoubi] M2AN 43:523–561, 2009.

Long-time behaviour of smooth solutions

... at the Oldroyd-B macro level !

Test Oldroyd-B system with $(\mathbf{u}, \mathbf{I} - \boldsymbol{\sigma}^{-1})$

then $F(\mathbf{u}, \boldsymbol{\sigma}) = \frac{\text{Re}}{2} \int_{\mathcal{D}} |\mathbf{u}|^2 + \frac{\varepsilon}{2\text{Wi}} \int_{\mathcal{D}} \text{tr}(\boldsymbol{\sigma} - \ln \boldsymbol{\sigma} - \mathbf{I})$ satisfies

$$\frac{d}{dt} F + (1 - \varepsilon) \int_{\mathcal{D}} |\nabla \mathbf{u}|^2 + \frac{\varepsilon}{2\text{Wi}^2} \int_{\mathcal{D}} \text{tr}(\boldsymbol{\sigma} + \boldsymbol{\sigma}^{-1} - 2\mathbf{I}) = 0$$

Can we mimick that at a discrete level ? – Key points:

- $\boldsymbol{\sigma}$ must remain SPD at all times for $\boldsymbol{\sigma}^{-1}$, $\ln \boldsymbol{\sigma}$ to exist
- concavity of \ln essential for $\frac{d}{dt} (\text{tr} \ln \boldsymbol{\sigma} \equiv \ln \boldsymbol{\sigma} : \mathbf{I}) = \frac{d\boldsymbol{\sigma}}{dt} : \boldsymbol{\sigma}^{-1}$
- transport terms $(\mathbf{u} \cdot \nabla) \mathbf{u}$ and $(\mathbf{u} \cdot \nabla) \boldsymbol{\sigma} - (\nabla \mathbf{u}) \boldsymbol{\sigma} - \boldsymbol{\sigma} (\nabla \mathbf{u})^T$ must not bring spurious energy (fluid is incompressible)
- internal energy exchanges cancel by micro/macro coupling
- the remaining terms should remain dissipative



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1) Time continuous – Space discrete Galerkin

Find $\mathbf{u}_h \in \mathbf{W}_h$, $p_h \in Q_h$, $\boldsymbol{\sigma}_h \in S_h$ such that $0 \geq \dots$:

$$\begin{aligned} 0 &= \text{Re} \int_{\mathcal{D}} \left[\frac{\partial \mathbf{u}_h}{\partial t} + (\mathbf{u}_h \cdot \nabla) \mathbf{u}_h \right] \cdot \mathbf{u}_h \\ &\quad + \int_{\mathcal{D}} \left[(1 - \varepsilon) \nabla \mathbf{u}_h + \frac{\varepsilon}{\text{Wi}} \boldsymbol{\sigma}_h \right] : \nabla \mathbf{u}_h \\ &\quad + \frac{\varepsilon}{2\text{Wi}^2} \times \\ 0 &= \text{Wi} \int_{\mathcal{D}} \left[\frac{\partial \boldsymbol{\sigma}_h}{\partial t} + (\mathbf{u}_h \cdot \nabla) \boldsymbol{\sigma}_h - (\nabla \mathbf{u}_h) \boldsymbol{\sigma}_h - \boldsymbol{\sigma}_h (\nabla \mathbf{u}_h)^T \right] : (\mathbf{I} - \boldsymbol{\sigma}_h^{-1}) \\ &\quad + \int_{\mathcal{D}} (\mathbf{I} - \boldsymbol{\sigma}_h) : (\mathbf{I} - \boldsymbol{\sigma}_h^{-1}) \\ \Rightarrow \mathbf{I}, \boldsymbol{\sigma}_h^{-1} &\in S_h \end{aligned}$$

1) Time continuous – Space discrete Galerkin

Find $\mathbf{u}_h \in \mathbf{W}_h$, $p_h \in Q_h$, $\boldsymbol{\sigma}_h \in S_h$ such that $0 \geq \dots$:

$$\begin{aligned}
 0 &= \operatorname{Re} \frac{d}{dt} \left(\int_{\mathcal{D}} \frac{|\mathbf{u}_h|^2}{2} \right) + \int_{\mathcal{D}} (\operatorname{div} \mathbf{u}_h) \frac{|\mathbf{u}_h|^2}{2} \\
 &\quad + (1 - \varepsilon) \int_{\mathcal{D}} |\nabla \mathbf{u}_h|^2 + \frac{\varepsilon}{\operatorname{Wi}} \int_{\mathcal{D}} \boldsymbol{\sigma}_h : \nabla \mathbf{u}_h \\
 &\quad + \frac{\varepsilon}{2\operatorname{Wi}^2} \times \\
 0 &= \operatorname{Wi} \int_{\mathcal{D}} \left[\frac{\partial}{\partial t} + (\mathbf{u}_h \cdot \nabla) \right] \operatorname{tr}(\boldsymbol{\sigma}_h - \ln \boldsymbol{\sigma}_h) + \int_{\mathcal{D}} \boldsymbol{\sigma}_h : \nabla \mathbf{u}_h \\
 &\quad + \int_{\mathcal{D}} \operatorname{tr}(2\mathbf{I} - \boldsymbol{\sigma}_h - \boldsymbol{\sigma}_h^{-1})
 \end{aligned}$$

$$\Rightarrow \mathbf{I}, \boldsymbol{\sigma}_h^{-1} \in S_h + \boldsymbol{\sigma}_h \in \mathbb{R}_{\operatorname{SPD}}^{d \times d} + \operatorname{tr}(\boldsymbol{\sigma}_h - \ln \boldsymbol{\sigma}_h) \in Q_h$$

1) Time continuous – Space discrete Galerkin

Find $\mathbf{u}_h \in \mathbf{W}_h$, $\mathbf{p}_h \in \mathbf{Q}_h$, $\boldsymbol{\sigma}_h \in \mathbf{S}_h$ such that $0 \geq \dots$:

$$\begin{aligned}
 0 &= \operatorname{Re} \frac{d}{dt} \left(\int_{\mathcal{D}} \frac{|\mathbf{u}_h|^2}{2} \right) + \cancel{\int_{\mathcal{D}} (\operatorname{div} \mathbf{u}_h) \frac{|\mathbf{u}_h|^2}{2}} \\
 &\quad + (1 - \varepsilon) \int_{\mathcal{D}} |\nabla \mathbf{u}_h|^2 + \frac{\varepsilon}{\operatorname{Wi}} \int_{\mathcal{D}} \boldsymbol{\sigma}_h : \nabla \mathbf{u}_h \\
 &\quad + \frac{\varepsilon}{2\operatorname{Wi}^2} \times \\
 0 &= \operatorname{Wi} \int_{\mathcal{D}} \frac{\partial}{\partial t} \operatorname{tr}(\boldsymbol{\sigma}_h - \ln \boldsymbol{\sigma}_h) + \cancel{\int_{\mathcal{D}} \boldsymbol{\sigma}_h : \nabla \mathbf{u}_h} \\
 &\quad + \int_{\mathcal{D}} \operatorname{tr}(2\mathbf{I} - \boldsymbol{\sigma}_h - \boldsymbol{\sigma}_h^{-1})
 \end{aligned}$$

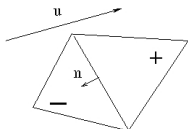
$$\mathbf{S}_h = [\mathbb{P}_0]_{\mathcal{S}}^{d \times d}, \quad \mathbf{Q}_h = \mathbb{P}_{d-1, \text{disc}}, \quad \mathbf{W}_h = [\mathbb{P}_d]^d \quad (\operatorname{div} \mathbf{u}_h = 0)$$

1) Time continuous – Space discrete Galerkin

Consequences: we require $\mathbf{u}_h \cdot \mathbf{n}$ continuous over edges E_j ,

- advection of σ_h requires jumps (Discontinuous Galerkin)

$$\sum_{j=1}^{N_E} \int_{E_j} |\mathbf{u}_h \cdot \mathbf{n}| [[\sigma_h]] : \{\phi\} = \sum_{j=1}^{N_E} \int_{E_j} |\mathbf{u}_h \cdot \mathbf{n}| (\sigma_h^+ - \sigma_h^-) : \left(\frac{\phi^+ + \phi^-}{2} \right)$$



- Scott-Vogelius velocity-pressure spaces $[\mathbb{P}_d]^d \times \mathbb{P}_{d-1, disc}$ require Arnold-Qin meshes for inf-sup stability

NB: inf-sup stable (\mathbf{u}_h, p_h) could also be Bernardi-Raugel

$[\mathbb{P}_1]^d \oplus \{\phi_i \mathbf{n}_i \in \mathbb{P}_2\}_{1 \leq i \leq d} \times \mathbb{P}_0$ or low-order Taylor-Hood $[\mathbb{P}_2]^d \times \mathbb{P}_0$



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2) Time – Space discrete Galerkin

For discretization of material time derivative of σ_h on $[t_n, t_{n+1}]$:

- $\frac{d}{dt} \text{tr} \ln \sigma_h = \frac{d}{dt} \sigma_h : \sigma_h^{-1}$ relies on the concavity of \ln , which can be invoked with e.g. backward Euler + implicit testing

$$\int_{\mathcal{D}} \left(\sigma_h^{n+1} - \sigma_h^n \right) : \left(\sigma_h^{n+1} \right)^{-1} \leq \int_{\mathcal{D}} \left(\text{tr} \ln \sigma_h^{n+1} - \text{tr} \ln \sigma_h^n \right)$$

- Similar trick in advection: use \ln concavity + upwinding
 $\int_{E_j} |\mathbf{u}_h^n \cdot \mathbf{n}| \llbracket \sigma_h^{n+1} \rrbracket : \left(\{ \sigma_h^{n+1} \} + \frac{1}{2} \llbracket \sigma_h^{n+1} \rrbracket \right) \equiv \left(\sigma_h^{n+1} \right)^{+ \mathbf{u}_h}$

As a result:

- the discrete free-energy estimate is only an inequality
- recall $(\nabla \mathbf{u}_h^{n+1}) \sigma_h^{n+1}$, the fully discrete scheme is implicit

Fully discrete numerical scheme

Find $(\mathbf{u}_h^{n+1}, p_h^{n+1}, \boldsymbol{\sigma}_h^{n+1}) \in [\mathbb{P}_d]^d \times \mathbb{P}_{d-1, disc} \times [\mathbb{P}_0]_S^{d \times d} / \forall (\mathbf{v}, q, \phi)$

$$\begin{aligned}
 0 = & \operatorname{Re} \int_{\mathcal{D}} \left[\frac{\mathbf{u}_h^{n+1} - \mathbf{u}_h^n}{\Delta t} + \mathbf{u}_h^n \cdot \nabla \mathbf{u}_h^{n+1} \right] \cdot \mathbf{v} + (1 - \varepsilon) \nabla \mathbf{u}_h^{n+1} : \nabla \mathbf{v} \\
 & + \frac{\varepsilon}{\operatorname{Wi}} \boldsymbol{\sigma}_h^{n+1} : \nabla \mathbf{v} - p_h^{n+1} \operatorname{div} \mathbf{v} + q \operatorname{div} \mathbf{u}_h^{n+1} \\
 0 = & \sum_{k=1}^{N_K} \int_{K_k} \left[\frac{\boldsymbol{\sigma}_h^{n+1} - \boldsymbol{\sigma}_h^n}{\Delta t} \right] : \phi + \sum_{j=1}^{N_E} \int_{E_j} |\mathbf{u}_h^n \cdot \mathbf{n}| [\boldsymbol{\sigma}_h^{n+1}] : \phi^+ \\
 & + \sum_{k=1}^{N_K} \int_{K_k} \left[\frac{\boldsymbol{\sigma}_h^{n+1} - \mathbf{I}}{\operatorname{Wi}} - (\nabla \mathbf{u}_h^{n+1}) \boldsymbol{\sigma}_h^{n+1} + \boldsymbol{\sigma}_h^{n+1} (\nabla \mathbf{u}_h^{n+1})^T \right] : \phi
 \end{aligned}$$

Discrete free-energy estimate

$$F_h^n \equiv F(\mathbf{u}_h^n, p_h^n, \boldsymbol{\sigma}_h^n) = \frac{\text{Re}}{2} \int_{\mathcal{D}} |\mathbf{u}_h^n|^2 + \frac{\varepsilon}{2Wi} \int_{\mathcal{D}} \text{tr}(\boldsymbol{\sigma}_h^n - \ln \boldsymbol{\sigma}_h^n - \mathbf{I})$$

Theorem

$\forall \boldsymbol{\sigma}_h^0$ spd, \exists at least 1 discrete solution / $\forall n \in \mathbb{N}$, $\boldsymbol{\sigma}_h^n$ spd, and

$$F_h^{n+1} - F_h^n + \frac{\text{Re}}{2} \int_{\mathcal{D}} |\mathbf{u}_h^{n+1} - \mathbf{u}_h^n|^2 + \Delta t_n (1 - \varepsilon) \int_{\mathcal{D}} |\nabla \mathbf{u}_h^{n+1}|^2 \\ + \Delta t_n \frac{\varepsilon}{2Wi^2} \int_{\mathcal{D}} \text{tr}(\boldsymbol{\sigma}_h^{n+1} + (\boldsymbol{\sigma}_h^{n+1})^{-1} - 2\mathbf{I}) \leq 0$$

Boyaval Lelièvre Mangoubi, M2AN, 43:523-561, 2009.

Barrett Boyaval, M3AS, 2010, preprint arxiv:09074066

Variation 1: Advection of σ_h

A Lagrangian approach is also possible

$$\int_{\mathcal{D}} \left[\frac{\sigma_h^{n+1} - \sigma_h^n \circ \psi^n(t^n; \cdot)}{\Delta t} \right] : \phi$$

using the flow $\psi^n(t^n; \cdot)$, but computationally more difficult

$$\left(\text{characteristics } \psi^n(t^{n+1}; \mathbf{x}) = \mathbf{x}; \frac{d\psi^n(t; \mathbf{x})}{dt} = \mathbf{u}_h^n(\psi^n(t; \mathbf{x})) \right)$$

and even possibly unstable (depends on quadrature) !

Variation 2: Other FE spaces

- Other FE for (\mathbf{u}_h, p_h) :
usual Navier-Stokes choices possible,
but require vertex integration / projection in convective term
- Other (higher-degree) FE for σ_h :
we require discontinuous $\pi(\sigma_h^{-1}) \in \mathbb{P}_0$ and
vertex integration / projection in some terms too

So higher-degree FE for σ_h may not be very interesting
(though full error estimation remains to be done).

NB: what about higher-order time discretization (BDF, RK) ?
(have to find corresponding test functions, nonlinear in σ_h !)

Variation 3: Other formulations

Old history: (D)-EVSS-(G) (+ stabilization) to handle *change of type* (new entrant characteristics: OB becomes UCM).

Recently: “log-formulation” showed a bit more successful than standard formulations by different authors ([Hulsen Fattal Kupferman 2005], [Turek]). We find quite similar constraint on discretizations.

No direct link with occurrence of $\ln \sigma$ in our estimate: only positivity preservation after discretization, see next slide.

(Lie-derivative also proposed [Lee-Xu 2006], but no numerics.)

NB: piecewise constant σ_h necessary for log: large numerical error when going back-and-forth to old/new formulations ?

Additional result 1: Uniqueness

In addition to existence of global discrete solutions which satisfies a free-energy estimate, we have uniqueness, under a CFL condition. Indeed, σ_h^{n+1} has to remain spd, hence:

- by Banach-Picard fixed point theorem, a solution exists within the open, convex set of spd matrices in a small ball around σ_h^n (for small Δt)
- by Brouwer fixed point theorem, regularized schemes (positivity constraint relaxed) have solutions, converging to a real free-energy solution after extraction of subsequence

NB: we also studied a scheme discretizing $\ln \sigma$ rather than σ . Then, no regularization, no subsequence, hence any solution satisfies the free-energy estimate (non spd solutions excluded).

Additional result 2: Convergence

- The free-energy dissipation implies long-time stability of discrete solutions and convergence $(\mathbf{u}_h^n, \boldsymbol{\sigma}_h^n) \xrightarrow{n \rightarrow \infty} (\mathbf{0}, \mathbf{I})$ (unique stationary state: homogeneous Dirichlet BC !)
- Adding an extra-diffusion term in the Oldroyd-B equation $\Delta \boldsymbol{\sigma}$, continuous solutions to regularized discrete schemes $(\boldsymbol{\sigma}_h \in [\mathbb{P}_1]_S^{d \times d}$:trick !) can be shown to converge as $h \rightarrow 0$ to a regularized model, with truncated advection for $\boldsymbol{\sigma}$ (if $d = 2$, truncation can be replaced with a CFL condition)

[5] J.W. Barrett and S. Boyaval. Global solutions to some regularized free-energy-dissipative Oldroyd-like models (accepted for publication in M3AS), arxiv:0907.4066, 2009.

(NB: recall, accurate error estimation remains to be done)

Additional result 2 continued (some details)

To achieve free-energy-dissipative convergence with $\Delta\sigma_h, \sigma_h \in [\mathbb{P}_1]_S^{d \times d}$:

- 1 $\Delta\sigma_h$: new BC $\mathbf{n} \cdot \nabla\sigma_h = 0$, “free-energy dissipative” on non-obtuse simplices (like for discrete maximum principle)
- 2 $(\mathbf{u}_h, p_h) \in [\mathbb{P}_2]^d \times \mathbb{P}_1$ or mini-element $[\mathbb{P}_1]^d \oplus \text{bubble} \times \mathbb{P}_1$
- 3 advection $(\mathbf{u}_h \cdot \nabla)\sigma_h$: discretized to avoid $\nabla\sigma_h$ on noting

$$\int_D [(\mathbf{u}_h \cdot \nabla)\sigma_h] : \sigma_h^{-1} = \int_D [(\mathbf{u}_h \otimes \mathbf{I}) \otimes \sigma_h] :: \nabla(\sigma_h^{-1}) = \int_D (\mathbf{u}_h \cdot \nabla) \ln(\sigma_h^{-1})$$

- 4 vertex integration in terms $\partial_t\sigma_h, \sigma_h \nabla\mathbf{u}_h$ and $\mathbf{I} - \sigma_h$ to use pointwise properties of the test function $\mathbf{I} - \mathcal{I}_1\sigma_h^{-1}$
- 5 Aubin-Lions compactness theory: quasi-uniform mesh, convex domain (test against C^0 FE projections of “ $\partial_t\mathbf{u}_h$ ”). Difficulty: σ should remain SPD after subseq. extraction !



Extensions

... to other mathematical frameworks

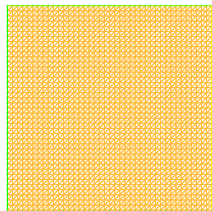
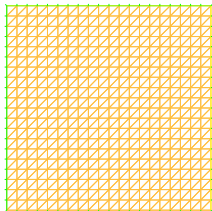
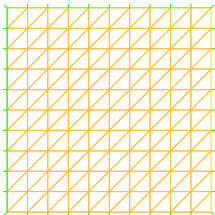
Extensions to other boundary conditions: not obvious !

But other models can be treated exactly the same way.

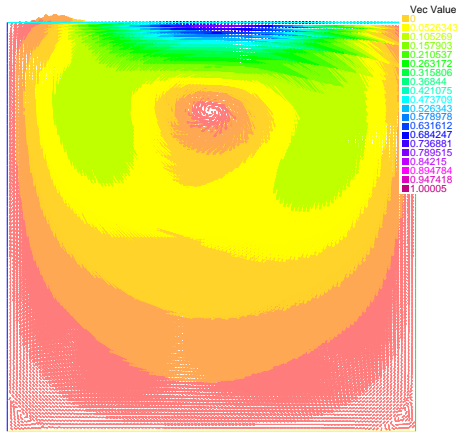
(FENE-P, debris flows: in progress, with co-authors + D. Benoît, F. Bouchut)

Lid-driven-cavity test case: setting

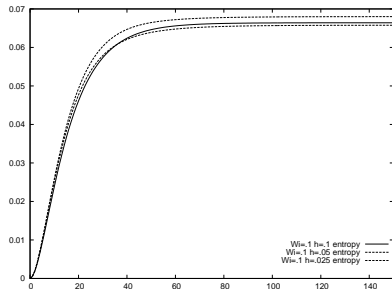
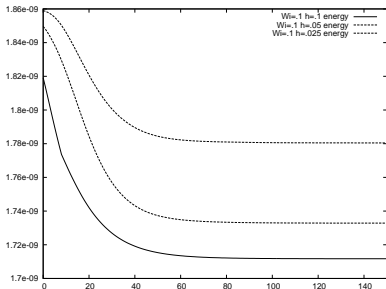
“pseudo” transient to get stationary state with
 $u = [16x^2(1 - x)^2, 0]$ on top, no-slip elsewhere



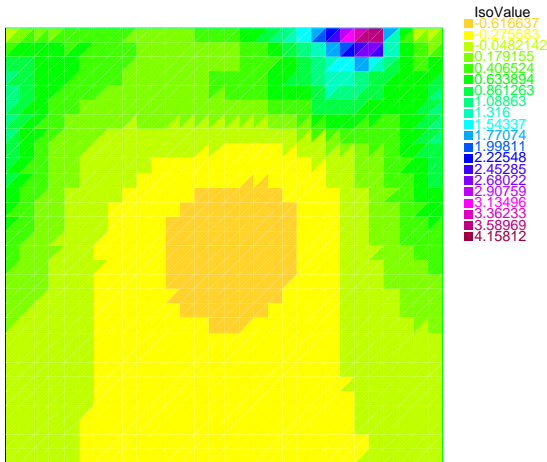
Lid-driven-cavity test case: low-Reynolds (creeping flow)



Lid-driven-cavity test case: physical quantities



Lid-driven-cavity test case: singularity



Free-energy dissipation

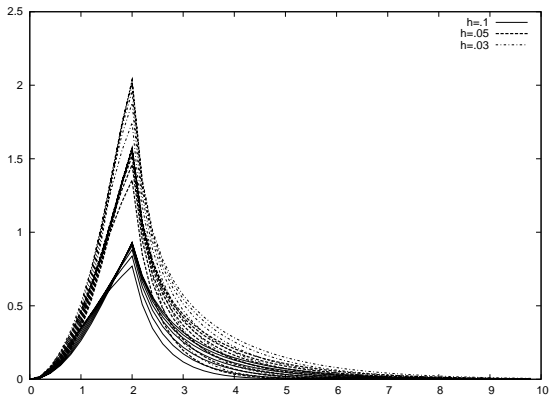


Figure: Different choices: no scheme blows up. (Anyway, no HWNP !)

Convergence: free-energy HWNP ?

Constant forcing: stationary state ?

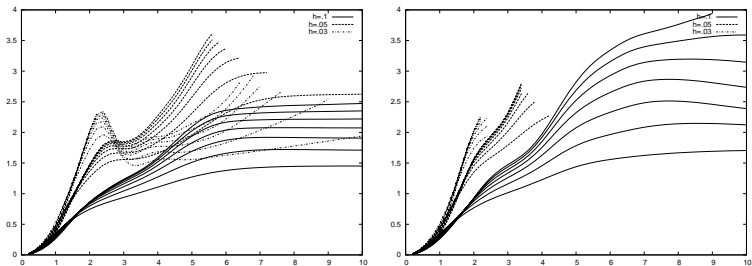
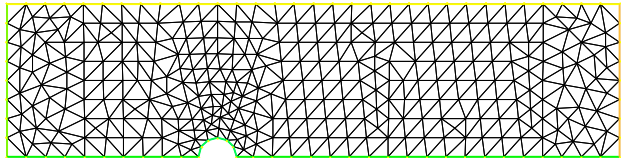


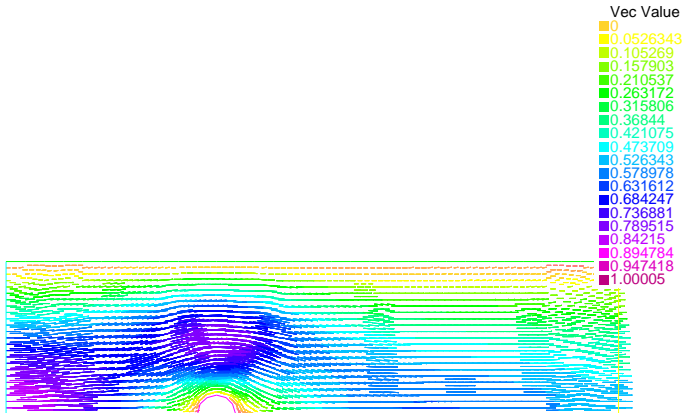
Figure: Left: \mathbb{P}_0 (OK) – Right: \mathbb{P}_1 (OK)

Flow past a cylinder test case: setting

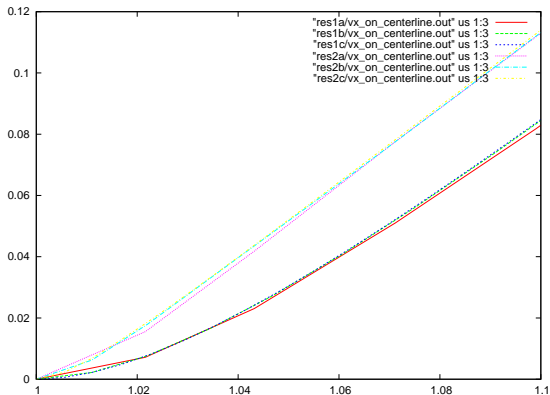
“pseudo” transient to get stationary state with inflow/outflow (peridodic or Poiseuille + free outflow) and no-slip elsewhere



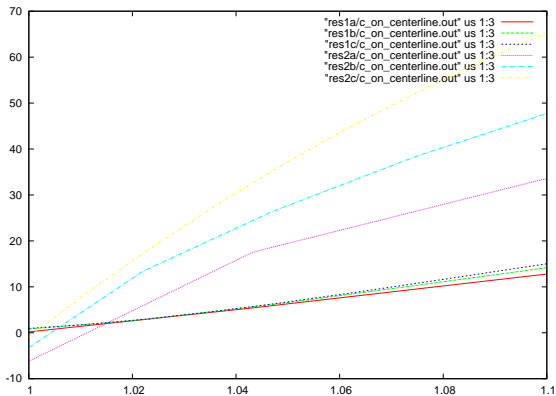
Flow past a cylinder test case: low-Reynolds (creeping flow)



Flow past a cylinder test case: velocity



Flow past a cylinder test case: stress singularity





Polymer flow modelling and simulation

Constitutive equations: progress in mathematical understanding

We have shown:

- (new) physically interesting free-energy estimates (for micro-macro models and constitutive equations)
- and corresponding mathematical results still being explored (for discrete and continuous models).

A thorough study of numerical results wrt HWNP is still needed.

For Further Reading I



R. G. Owens and T. N. Philips.

Computational rheology.

Imperial College Press / World Scientific, 2002.



B. Jourdain, C. Le Bris, T. Lelièvre, and F. Otto.

Long-time asymptotics of a multiscale model for polymeric fluid flows.

Archive for Rational Mechanics and Analysis,
181(1):97–148, 2006.





D. Hu and T. Lelièvre.

New entropy estimates for the Oldroyd-B model, and related models.

Commun. Math. Sci., 5(4):906–916, 2007.

For Further Reading II

-  S. B., T. Lelièvre and C. Mangoubi
Free-energy-dissipative schemes for the Oldroyd-B model
M2AN, 43 : 523-561, 2009.
-  J. W. Barrett and S. B.
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Parametrized r.v. $Z^\mu \in L^2(\Omega)$ in Monte-Carlo

Goal: compute expectation $E(Z^\mu)$ for many μ .

Monte-Carlo with confidence intervals (CLT+Slutsky) $\forall a > 0$

$$E_M(Z^\mu) := \frac{1}{M} \sum_{m=1}^M Z_m^\mu \xrightarrow[M \rightarrow \infty]{P\text{-a.s.}} E(Z^\mu) \quad \text{Var}_M(Z^\mu) = \dots$$

$$P \left(|E_M(Z^\mu) - E(Z^\mu)| \leq a \sqrt{\frac{\text{Var}_M(Z^\mu)}{M}} \right) \xrightarrow[M \rightarrow \infty]{} \int_{-a}^a \frac{e^{-x^2/2}}{\sqrt{2\pi}} dx$$

Faster MC with variance reduced by control variates Y^μ :

Compute $E(Z^\mu) = E(Z^\mu - Y^\mu) + E(Y^\mu)$ where

- $E(Y^\mu)$ is known (here $E(Y^\mu) = 0$)
- $\text{Var}(Z^\mu) \geq \text{Var}(Z^\mu - Y^\mu)$.

Control variates: practical variance reduction

Ideally $Y^\mu = Z^\mu - E(Z^\mu) \Rightarrow \text{Var}(Z^\mu - Y^\mu) = 0$, but in practice:

Compute $\tilde{Y}^\mu \approx Y^\mu$ minimizing

$$\text{Var}(Z^\mu - \tilde{Y}^\mu) = E(|(Z^\mu - E(Z^\mu)) - \tilde{Y}^\mu|^2) = E(|Y^\mu - \tilde{Y}^\mu|^2)$$

Faster MC with RB approach :

$$\tilde{Y}^\mu := \sum_{n=1}^N \alpha_n(\mu) Y^{\mu n} = \sum_{n=1}^N \alpha_n(\mu) (Z^{\mu n} - E(Z^{\mu n}))$$

where the $\alpha_n(\mu)$ minimize $\text{Var}(Z^\mu - \tilde{Y}^\mu)$

$$E_{M_{\text{small}}} (Z^\mu - \tilde{Y}^\mu) = \frac{1}{M_{\text{small}}} \sum_{m=1}^{M_{\text{small}}} (Z_m^\mu - \tilde{Y}_m^\mu) \xrightarrow[M_{\text{small}} \rightarrow \infty]{P\text{-a.s.}} E(Z^\mu).$$

Control variates: practical variance reduction

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Faster MC with RB approach :

$$\tilde{Y}^\mu := \sum_{n=1}^N \alpha_n(\mu) Y^{\mu n} \approx \sum_{n=1}^N \alpha_n(\mu) (Z^{\mu n} - E_{M_{\text{large}}}(Z^{\mu n}))$$

where the $\alpha_n(\mu)$ minimize $\text{Var}_{M_{\text{small}}}(Z^\mu - \tilde{Y}^\mu)$

$$E_{M_{\text{small}}}(Z^\mu - \tilde{Y}^\mu) = \frac{1}{M_{\text{small}}} \sum_{m=1}^{M_{\text{small}}} (Z_m^\mu - \tilde{Y}_m^\mu) \xrightarrow[M_{\text{small}} \rightarrow \infty]{P\text{-a.s.}} E(Z^\mu).$$

Effective RB control variates method in practice

Effective numerical variance minimizations:

For all μ , solve the least-square problem by usual methods

$$\inf_{\{\alpha_1(\mu), \dots, \alpha_N(\mu)\}} \text{Var}_{M_{\text{small}}} \left(Z^\mu - \sum_{n=1}^N \alpha_n(\mu) (Z^{\mu_n} - E(Z^{\mu_n})) \right)$$

For instance, SVD or QR for the normal equations ($i = 1, \dots, N$)

$$\sum_{j=1}^N \text{Cov}_{M_{\text{small}}} (Z^{\mu_i}, Z^{\mu_j}) \alpha_j^\mu = \text{Cov}_{M_{\text{small}}} (Z^{\mu_i}, Z^\mu)$$

Computational gains:

Only in the many-query limit = many μ !

(Offline: N expensive computations $E_{M_{\text{large}}} (Z^{\mu_n})$ + greedy)

⇒ OK for many observations s^* , or a large response surface !