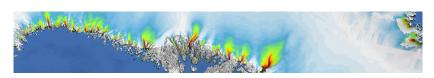
# Mathematical tools and obstacles in models of ice sheets

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### Outline

I. an introduction to ice sheet flow for non-glaciologists

## ice in glaciers is a viscous fluid





- ... at least: glaciers are viscous flows at larger scales
- glaciers are free-surface flows (with no surface tension)
- usage: "ice sheets" = big, continent-scale glaciers



# ice in glaciers is a viscous fluid

- ullet primary variables: velocity  $\mathbf{u}(\mathbf{x},t)$  and pressure  $p(\mathbf{x},t)$
- ullet also: ho is density,  ${f g}$  is gravity, u is viscosity
- if the glacier fluid were "typical" like the ocean we would model with Navier-Stokes equations:

$$abla \cdot \mathbf{u} = 0$$
 incompressibility  $ho \left( \mathbf{u}_t + \mathbf{u} \cdot \nabla \mathbf{u} \right) = -\nabla p + \nu \nabla^2 \mathbf{u} + \rho \mathbf{g}$  stress balance

- but ice is not typical!
- e.g. not a worry in ice sheet flow models:
  - turbulence
  - o coriolis force
  - convection

# ice is a slow, shear-thinning viscous fluid

- glacier ice is
  - 1. "slow"1:

$$\rho\left(\mathbf{u}_t + \mathbf{u} \cdot \nabla \mathbf{u}\right) \approx 0 \qquad \Longleftrightarrow \qquad \begin{pmatrix} \text{forces of inertia} \\ \text{are negligible} \end{pmatrix}$$

- 2. non-Newtonian shear-thinning<sup>2</sup>:
  - viscosity  $\nu$  is not constant
  - $\bullet$   $\nu$  decreases as fluid is sheared

 $<sup>^1</sup>Fr \approx 10^{-15}$ . Regarding coriolis:  $Fr/Ro \approx 10^{-8}$ .

<sup>&</sup>lt;sup>2</sup>blood is also shear-thinning corn starch in water is shear-thickening

### the standard model

- slow flows are called "Stokes flows"
- notation:
  - o  $au_{ij}$  is deviatoric stress tensor
  - $\circ$   $\mathbf{D}u_{ij}$  is strain rate tensor
- the standard ice flow model is power-law Stokes:

$$abla \cdot \mathbf{u} = 0$$
 incompressibility  $0 = -\nabla p + \nabla \cdot \tau_{ij} + \rho \mathbf{g}$  slow stress balance  $\mathbf{D}u_{ij} = A \left| \tau_{ij} \right|^{n-1} \tau_{ij}$  Glen flow law

- 1.8 < n < 4.0 ? when in doubt: n = 3
- *A* > 0 is "ice softness"
  - ullet A varies strongly with temperature, but I'll ignore that here

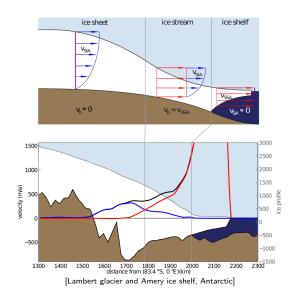
# model design (because ice is a slow fluid)

- ice sheet modeling is a bit like atmosphere flow modeling or weather prediction, but ....
- in a Stokes flow, the geometry, boundary stress, and viscosity determine velocity field and pressure, so ...
- therefore a time-stepping ice sheet model recomputes the velocity field when needed, without requiring velocity from a previous time-step<sup>3</sup>

³to be a weatherman you've got to know which way the wind blows ...but not to be a glaciologist

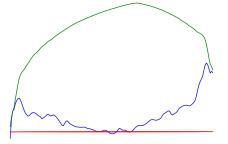
### sheets versus streams versus shelves

- non-sliding portions of ice sheets flow by shear deformation
- ice streams slide too
- "ice shelves" are floating thick ice
   ... all sliding
- ice shelves flow by extension not shear
- but: sliding ignored for today



### ice sheets are shallow

- ullet cross-section of Greenland ice sheet at  $71^\circ$  N
  - o green and blue: usual vertically-exaggerated version



- in red: a view without this vertical exaggeration
- thus:
  - most simulations use shallow limits of Stokes
  - o technical: high aspect-ratio elements bad in non-shallow solvers

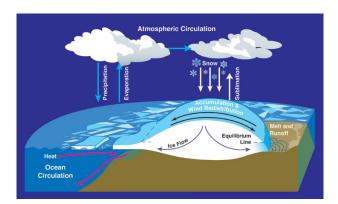


## first big picture: ice sheets store past climates

Greenland layers movie from NASA, January 2015

## second big picture: ice sheets affect sea level

- mass and energy inputs: (1) snow adds, (2) sun heats, (3) ocean heats, (4) earth heats
- mass outputs: (1) surface meltwater, (2) basal meltwater, (3) ice discharge



## summary so far

- ice sheets have five outstanding properties as viscous flows:
  - 1. free surface
  - 2. shallow
  - 3. slow
  - 4. shear-thinning
  - 5. sliding ("contact slip")
- remainder of my talk will address applied-mathematical questions for models which capture

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part II properties 1, 2, 3, 4 but not 5
part III any time-dependent model which has properties 1 and 2
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### Outline

II. is the shallow ice problem well-posed and approximate-able?

# shallow ice approximation (SIA)

- SIA = "lubrication" approximation of Stokes model
- good approximation when:
  - sliding is small or zero
  - bedrock slope is modest
- derive SIA equations by scaling Stokes using shallowness:
  - [h] is a typical thickness scale
  - $\circ$  [x] is a typical width scale
  - small parameter is  $\epsilon = [h]/[x]$

# SIA: velocity

- b(x,y) is bedrock elevation (data)
- s(x, y, t) is ice surface elevation (unknown)
- let p = n + 1 > 2
- assume: no sliding and isothermal
- horizontal ice velocity is given by:

$$\mathbf{U} = -\frac{p}{p+1}\Gamma\left[(s-b)^p - (s-z)^p\right]|\nabla s|^{p-2}\nabla s$$

where  $\Gamma > 0$  combines gravity, ice density, ice softness

- a(x,y) is snowfall minus melt rate (data)
  - o a.k.a. "surface mass balance"
- mass conservation in steady state:

$$\nabla \cdot \left( \int\limits_{b}^{s} \mathbf{U} \, dz \right) = a$$

• shallow ice approximation + (steady) mass conservation:

$$-\nabla \cdot \left(\Gamma(s-b)^{p+1}|\nabla s|^{p-2}\nabla s\right) = a$$

- this is "the SIA equation" for ice sheet geometry
- $\circ$  like Poisson equation  $-\nabla \cdot (D\nabla u) = f$
- $\circ p$ -Laplace-ish ... but coefficient  $(s-b)^{p+1} \to 0$  at margins
- equation above is simplest model for turning data of problem (b and a) into ice sheet geometry and velocity (s and U)

## time-dependent SIA

time-dependent SIA equation

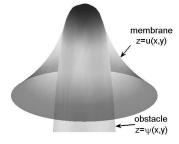
$$\frac{\partial s}{\partial t} + \nabla \cdot \left( \Gamma(s-b)^{p+1} |\nabla s|^{p-2} \nabla s \right) = a$$

the Halfar (1983) similarity solution:

- o an exact b=0, a=0 solution with  $t\to 0^+$  limit a delta function
- compare Barenblatt solution of porous medium equation
- $\circ$  movie frames from t=4 months to  $t=10^6$  years, equally-spaced in exponential time

## SIA: an analogy

- bedrock ∼ obstacle



 classical Laplacian obstacle problem:

$$\triangle u = 0 \quad \& \quad u \ge \psi$$





## SIA equation is constrained

- H = s b is ice thickness
- thickness is a nonnegative quantity!
- steady state equation "strong form"

$$-\nabla \cdot \left(\Gamma H^{p+1} |\nabla s|^{p-2} \nabla s\right) = a$$

applies only where

$$s > b \iff H > 0$$

# weak formulation by variational inequality

define closed and convex admissible set

$$\mathcal{K} := \{ \eta : \eta^{2p/(p-1)} \in W_0^{1,p}(\Omega) \text{ and } \eta \ge 0 \}$$

over larger domain  $\Omega \subset \mathbb{R}^2$ 

• multiply strong form by  $\eta-H$  where  $\eta\in\mathcal{K}$ , and integrate by parts thoughtfully

#### definition

 $H \in \mathcal{K}$  solves the steady shallow ice sheet problem if

$$\int_{\Omega} \Gamma H^{p+1} |\nabla s|^{p-2} \nabla s \cdot \nabla (\eta - H) \ge \int_{\Omega} a(\eta - H)$$

for all  $\eta \in \mathcal{K}$ 

### ideas contained in weak formulation

weak form

$$\int_{\Omega} \Gamma H^{p+1} |\nabla s|^{p-2} \nabla s \cdot \nabla (\eta - H) \ge \int_{\Omega} a(\eta - H)$$

implies strong form

$$-\nabla \cdot \left(\Gamma H^{p+1} |\nabla s|^{p-2} \nabla s\right) = a$$

where H > 0

- weak form also implies: if H=0 then  $a \leq 0$
- if b=0 then the weak form is equivalent to a constrained minimization problem
  - $\circ$  for general bed b this is not so

# on well-posedness (Jouvet-Bueler 2012)

#### theorem A.

if b=0 then the variational inequality is equivalent to

$$\min J[u] = \int_{\Omega} \frac{\Gamma}{p} |\nabla u|^p - au$$

over  $\eta=u^{(p-1)/(2p)}\in\mathcal{K}$ , and this problem is well-posed (existence, uniqueness, stability w.r.t. data a)

#### theorem B.

in general case  $(b \neq 0)$  there exists a solution

- proof of B by a fixed-point theorem, of course
- we really don't know about uniqueness (not just technical)

# an interesting quality of this variational inequality

every glaciologist believes this about steady climates:

if 
$$a > 0$$
 on  $R$  then  $H > 0$  on  $R$ 

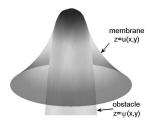
that is:

if it snows more than it melts then you get a glacier

 uniformly-elliptic variational inequalities, e.g. the classical obstacle problem,

$$\int\limits_{\Omega} \nabla u \cdot \nabla (v - u) \ge \int\limits_{\Omega} f(v - u),$$

for all  $v \geq \psi$ , do *not* have the analogous property



### another weak form

the variational inequality for shallow ice has abstract form

$$-\langle \mathbf{q}(H, \nabla H), \nabla(\eta - H) \rangle \ge \langle a, \eta - H \rangle \qquad \forall \eta \in \mathcal{K}$$

where  $\mathbf{q} = \int_b^s \mathbf{U} \, dz = -\Gamma H^{p+1} |\nabla s|^{p-2} \nabla s$  is the "flux"

a standard localization argument gives

$$F \ge 0$$
 and  $HF = 0$ 

where  $F = \nabla \cdot \mathbf{q} - a$ 

### finite-dimensional

• under (e.g.) finite element or volume discretization the shallow ice problem can be written:

$$H \in \mathbb{R}^m$$
 and  $F(H) \in \mathbb{R}^m$   $H \ge 0$  and  $F(H) \ge 0$   $H F(H) = 0$ 

• in unconstrained case we would just solve "F(H) = 0", so we call F the "residual"

### definition

for  $f: \mathbb{R}^m \to \mathbb{R}^m$ , we say  $x^* \in \mathbb{R}^m$  solves the *nonlinear* complementarity problem (NCP) if

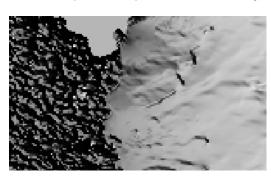
$$x^* \ge 0$$
 and  $f(x^*) \ge 0$  and  $x^* f(x^*) = 0$ 

- scalable Newton solvers are available for NCPs.
  - from PFTSc.

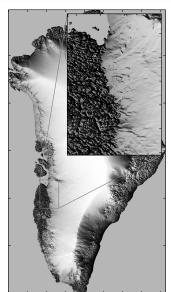


to to ice sheets shallow ice well-posed? conservation w free boundaries? conclusion

## example computation: steady Greenland ice sheet



- data is b(x,y) and a(x,y)
- 900 m grid on  $1500 \times 2600$  km domain
- NCP solved on 192 processors
  - o reduced-space Newton solver
  - double continuation by
    - o diffusivity regularization
    - bed smoothing

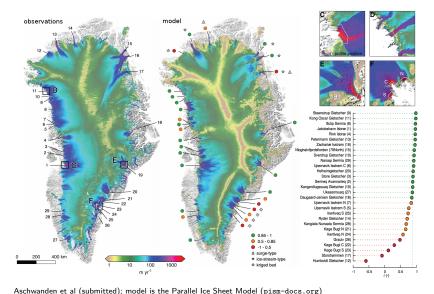








# Greenland velocity from a better model





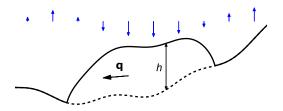




### Outline

III. can thin-layer free-boundary models exactly conserve?

## thin layers in a "climate"



abstract problem, of which ice sheets are one case:

$$h_t + \nabla \cdot \mathbf{q} \stackrel{*}{=} \mathbf{f}$$

on  $\Omega \subset \mathbb{R}^2$ , where  $\mathbf{q} = \mathbf{q}(\nabla h, h, x, t)$  and  $\mathbf{f} = \mathbf{f}(h, x, t)$ 

- h is layer thickness, q is flux, and f is source or "climate"
- PDE \* can be parabolic or hyperbolic . . . but it only applies where h > 0
- "h > 0" needs to be a constraint
  - o generates free boundary somewhere in region where f < 0



### examples



glaciers



tidewater marsh



ice shelves & sea ice



tsunami inundation (?)

and sea-level rise, surface hydrology, subglacial hydrology, . . .



### discrete time

numerical models for this problem must discretize time:

$$h_t + \nabla \cdot \mathbf{q} = f \qquad \longrightarrow \qquad \frac{h_n - h_{n-1}}{\Delta t} + \nabla \cdot \mathbf{Q}_n = F_n$$

- o in minimal sense: semi-discretize in time
- o backward Euler, trapezoid, RK, ...
- $\circ$  but remember constraint:  $h_n \geq 0$
- cartoon:



## a free-boundary problem for each time step

strong form for time step:

$$\frac{h_n - h_{n-1}}{\Delta t} + \nabla \cdot \mathbf{Q}_n = F_n, \qquad h_n \ge 0$$

• let  $\mathcal X$  be a Sobolev space for which the unconstrained "Poisson" problem on  $\Omega$  is well-posed:

$$\nabla \cdot \mathbf{Q}_n(\nabla v, v, x) = g$$

- let  $\mathcal{K} = \{ v \in \mathcal{X} \mid v \ge 0 \}$
- weak form for time step: find  $h_n \in \mathcal{K}$  so that

$$\langle A_n(h_n), v - h_n \rangle \ge 0$$
 for all  $v \in \mathcal{K}$ 

where 
$$\langle A_n(v), \phi \rangle := \int_{\Omega} (v - \Delta t \, F_n - h_{n-1}) \, \phi - \Delta t \, \mathbf{Q}_n \cdot \nabla \phi$$

### questions

for the weak form (variational inequality)

$$\langle A_n(h_n), v - h_n \rangle \ge 0$$
 for all  $v \in \mathcal{K}$ 

we have these questions:

- well-posedness: are implicit time-steps well-posed?
  - explicit time steps are well-posed
    - $\triangleright$  just compute  $h_n$  and truncate to impose  $h_n \ge 0$
    - $\,\,\vartriangleright\,\,$  but has severe stability time-step restrictions!
- exact conservation: can we exactly-balance the change in fluid mass over time step by computable integrals of f or  $F_n$ ?
  - o  $M_n = \rho \int_{\Omega} h_n(x) dx$  is the fluid mass at time  $t_n$

### well-posedness for each time step

 $\bullet$  the answer to the first question depends on the form of the flux  ${\bf q}$  ...but it is "usually" yes

### theorem (Bueler, in prep).

for a variety of flux forms  $\mathbf{q}(\nabla h,h,x,t)$ , a backward Euler time-step is well-posed

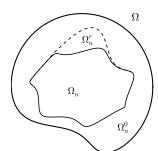
- p-Laplacian:  $\mathbf{q} = -k|\nabla h|^{p-2}\nabla h$
- porous medium and doubly-nonlinear:  $\mathbf{q} = -kh^r |\nabla h|^{p-2} \nabla h$ • includes SIA in flat bed-rock case
- advecting layer:  $\mathbf{q} = \mathbf{X}h$  where  $\mathbf{X}$  is a fixed velocity field
- certain nonlocal, but linear, forms

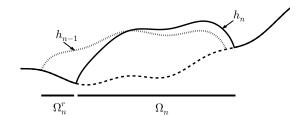
for the second question we define sets:

$$\begin{split} \Omega_n &= \{h_n(x) > 0\} \\ \Omega_n^r &= \{h_n(x) = 0 \text{ and } h_{n-1}(x) > 0\} \\ \Omega_n^0 &= \{h_n(x) = 0 \text{ and } h_{n-1}(x) = 0\} \end{split}$$

so that

$$\Omega = \Omega_n \cup \Omega_n^r \cup \Omega_n^0$$





### the discrete-time conservation issue

calculation:

$$\Delta t \left( -\nabla \cdot \mathbf{Q}_n + F_n \right)$$

$$M_n - M_{n-1} = \int_{\Omega_n} h_n - h_{n-1} dx + \int_{\Omega_n^r} 0 - h_{n-1} dx$$

$$= \Delta t \left( 0 + \int_{\Omega_n} F_n dx \right) - \int_{\Omega_n^r} h_{n-1} dx$$

define new term:

$$R_n = \int_{\Omega_L^r} h_{n-1} \, dx$$

is the retreat loss during time step n

### bad news for exact discrete conservation

### claim (Bueler, in prep).

• if the thin layer has a free boundary then you cannot exactly conserve, in the sense that there is no computable integral  $I_n$  of the source term f, over the time step, so that

$$M_n - M_{n-1} = I_n$$

restore balance by adding the retreat loss a posteriori:

$$M_n - M_{n-1} = C_n - R_n$$

where  $C_n=\Delta t\,\int_{\Omega_n}F_n\,dx$  is a computable integral of the source term and  $R_n=\int_{\Omega_n^r}h_{n-1}\,dx$  is computable from  $h_n$ 

I wonder how to make this into an honest theorem . . .



## practical conclusions for ice sheet modeling

- is steady shallow ice problem
  - well-posed? probably
  - approximate-able?
- can thin-layer free-boundary problems
  - be solved by implicit time-stepping?
    - be exactly discrete conserving?
      - but error can be quantified



