# Modeling Antarctic Ice Sheet Dynamics using Adaptive Mesh Refinement

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#### Marine Ice Sheets: Larsen B Breakup (2002)

• January 31, 2002







#### Marine Ice Shelves: Larsen B Breakup (2002)

• February 17, 2002







#### Marine Ice Shelves: Larsen B Breakup (2002)

• February 23, 2002







#### Marine Ice Shelves: Larsen B Breakup (2002)

• March 5, 2002







#### Aftermath...

- 3,250 square kilometers (1,250 square miles)
- Breakup took about 1 month
- Likely due to exceptionally warm summer
  - Melt pools on surface surface melting -> hydrofracture
  - Warm ocean temperatures in the Weddell Sea

- Results: Larsen A and B glaciers
  - abrupt acceleration, about 300% on average
  - mass loss went from 2–4 gigatonnes per year in 1996 and 2000 (gigatonne = one billion metric tonnes), to between 22 40 gigatonnes per year in 2006.
  - Not the last! (Wilkins, 2008-2009)



#### Why do we care?

#### **Global Sea Level Budget:**

- Ocean thermal expansion: ~1 mm/yr
- Glaciers and ice caps:
- Ice sheets:
  - Greenland 0.6 mm/yr
  - Antarctica 0.4 mm/yr
- Terrestrial storage:
  - Dam retention -0.3 mm/yr
  - Groundwater depletion 0.3 mm/yr

The ice sheet contribution has roughly **doubled** since 2000 and will likely continue to increase.



Antarctic ice mass loss (Velicogna 2009)



### ~1 mm/yr

~1 mm/yr

~0 mm/yr

#### **Currently two ice sheets...**

#### **Greenland Ice Sheet**

5-7 m Sea Level Equivalent (SLE)



#### **Antarctic Ice Sheet**

60 m SLE (4-5m in marine-grounded parts of West Antarctica)







Image: http://www.snowballearth.org



#### **Antarctic Marine Ice Sheet Instability**





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LeBrocq et al., 2010

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### **BISICLES Ice Sheet Model**

- Scalable adaptive mesh refinement (AMR) ice sheet model
  - Dynamic local refinement of mesh to improve accuracy
- Chombo AMR framework for block-structured AMR
  - Support for AMR discretizations
  - Scalable solvers
  - Developed at LBNL
  - DOE ASCR supported (FASTMath)
- Collaboration with Bristol (U.K.) and LANL
- Variant of "L1L2" model (Schoof and Hindmarsh, 2010)
- Now in second-round of SciDAC funding (PISCEES, ProSPect)
- Users in Berkeley, Bristol, Beijing, Brussels, and Berlin...







#### Why is this useful? (another BISICLE for another fish?)





- Ice sheets -- Localized regions where high resolution needed to accurately resolve ice-sheet dynamics (500 m or better at grounding lines)
- Antarctica is really big too big to resolve at that level of resolution.
- Large regions where such fine resolution is unnecessary (e.g. East Antarctica)
- Well-suited for adaptive mesh refinement (AMR)
- Problems still large: need good parallel efficiency
- Dominated by nonlinear coupled elliptic system for ice velocity solve: good linear and nonlinear solvers



### **Target Problems**

- Idealized Ice-Ocean interaction test problems
  - Simple/small geometries designed to understand GL dynamics and ice-ocean interactions
  - MISMIP3D, MISMIP+, MISOMIP

- Realistic full-scale
  - Fully-resolved (500m) full-continent
  - Antarctica





## **BISICLES: Models and Approximations**

**Physics: Non-Newtonian viscous flow:**  $\mu(\dot{\epsilon^2},T) = A(T)(\dot{\epsilon^2})^{\frac{(1-n)}{2}}$ Where  $\dot{\epsilon}^2$  is the strain rate invariant, typically n = 3

- "Full-Stokes"
  - Best fidelity to ice sheet dynamics
  - Computationally expensive (full 3D coupled nonlinear elliptic equations)

#### Approximate Stokes

- Use scaling arguments to produce simpler set of equations
- Common expansion is in ratio of vertical to horizontal length scales ( $\varepsilon = \frac{[h]}{[l]}$ )
- E.g. Blatter-Pattyn (most common "higher-order" model), accurate to  $O(\varepsilon^2)$
- Still 3D, but solve simplified elliptic system (e.g. 2 coupled equations)



## "L1L2" Model (Schoof and Hindmarsh, 2010)

Uses asymptotic structure of full Stokes system to construct a higher-order approximation

- Expansion in 
$$\varepsilon = \frac{[H]}{[L]}$$
 and  $\lambda = \frac{[\tau_{shear}]}{[\tau_{normal}]}$  (ratio of shear & normal stresses)

- Large λ: shear-dominated flow
- Small λ: sliding-dominated flow
- Computing velocity to  $O(\varepsilon^2)$  only requires  $\tau$  to  $O(\varepsilon)$
- Computationally much less expensive -- enables fully 2D vertically integrated discretizations. (can reconstruct 3d)
  - Recovers proper fast- and slow-sliding limits:
    - SIA  $(1 \ll \lambda \le \varepsilon^{-1/n})$  -- accurate to  $O(\varepsilon^2 \lambda^{n-2})$
    - SSA  $(\varepsilon \le \lambda \le 1)$  accurate to  $O(\varepsilon^2)$



#### Discretizations

- Baseline model:
  - Logically-rectangular grid, obtained from a time-dependent uniform mapping.
  - 2D equation for ice thickness *H*:

$$\frac{\partial H}{\partial t} = b - \nabla \cdot (H\overline{u})$$



- Vertically-integrated momentum balance results in 2D **nonlinear** viscous tensor solve (viscosity a function of velocity) for velocity  $\overrightarrow{u_b}$  at the base of the ice:

$$\beta^{2} \overrightarrow{u_{b}} + \nabla \cdot \left[ \mu \left( \dot{\varepsilon}^{2} \right) \left( \vec{\nabla} + \vec{\nabla}^{T} \right) \overrightarrow{u_{b}} - 2\mu \left( \nabla \cdot \overrightarrow{u_{b}} \right) \right] = -\frac{g}{\rho} H \vec{\nabla} s$$

 $\beta^2$  = friction coefficient,  $\dot{\varepsilon}$ = strain rate invariant of ice velocity, g = gravity,  $\rho$  = ice density, H = ice thickness,  $\vec{\nabla}s$  = horizontal gradient of upper surface

Enthalpy formulation for energy



#### **Discretizations**, cont

- Use of Finite-volume discretizations (vs. Finite-difference discretizations) simplifies implementation of local refinement.
- Software implementation based on constructing and extending existing solvers using the Chombo libraries.



#### **Chombo – Scalable Adaptive Mesh Refinement (AMR)**



#### Scalable adaptive mesh refinement (AMR) framework.

Enables implementing scalable AMR applications with support for complex geometries.



BERKELEY L

#### Adaptive Mesh Refinement (AMR)

- Block structured AMR dynamically focuses computational effort where needed to improve solution accuracy
- Designed as a developers' toolbox for implementing scalable AMR applications
- Implemented in C++/Fortran
- Solvers for hyperbolic, parabolic, and elliptic systems of PDEs

#### **Complex Geometries**

- Embedded-boundary (EB) methods use a cut-cell approach to embed complex geometries in a regular Cartesian mesh
- EB mesh generation is extremely efficient
- Structured EB meshes make high performance easier to attain

#### Higher-order finite-volume

- Higher (4th)-order schemes reduce memory footprint and improve arithmetic intensity
- Good fit for emerging architectures
- Both EB and mapped-multiblock approaches to complex geometry









#### **Nonlinear and Linear Solvers**

- 90% of computational time spent in nonlinear viscous tensor solve
- Jacobian-Free Newton Krylov (JFNK) + Picard iterative nonlinear solvers
- Need good linear solver performance!
- Chombo native solvers Geometric MultiGrid (GMG)
  - Follows Naturally from AMR hierarchy
  - When it works, it works really well (after some tuning)
  - Matrix-free!
  - Relatively efficient
- Other problems require AMG solvers
  - Link to PETSc (HYPRE, GAMG)





#### Mesh resolution requirements for marine AIS



#### **Experiment – 1000-year Antarctic simulations**

- Range of finest resolution from 8 km (no refinement) to 500m (4 levels of factor-2 refinement)
- Subgrid basal friction parameterization (e.g. Seroussi et al)
  - Experience shows that it buys us about a factor of 2x
- At initial time, subject ice shelves to extreme (outlandish) depth-dependent melting:
  - No melt for h < 100m</li>
  - Range up to 400 m/a where h > 800 m.
  - No melt applied in partially-grounded cells
- For each resolution, evolve for 1000 years



#### **Initial Condition for Antarctic Simulations**

- Full-continent Bedmap2 (2013) geometry
- Temperature field from Pattyn (2010)
- Initialize basal friction to match Rignot (2011) velocities
- SMB: Arthern et al (2006)
- AMR meshes: 8 km base mesh, adaptively refine to  $\Delta x_f$







Antarctic ice loss simulation using the SciDAC-supported BISICLES ice sheet model







### **Resolution requirements...**

- Upper plot Contribution to SLR
  - Convergent at sufficient resolution

- Lower plot -- Rate of Change
  - Big spike WAIS collapse
  - Timing, pathways are a function of resolution

"Adaptive mesh refinement versus subgrid friction interpolation in simulations of Antarctic Ice Dynamics", Cornford, Martin, Lee, Payne, Ng, *Annals of Glaciology*, 57 (73), 2016





#### **Evaluating Antarctic Vulnerability...**

• Next step – restrict forcing regionally



## Antarctic vulnerability to warm-water forcing

- Basic idea try to understand where AIS is vulnerable to forcing from warm-water incursions
  Antarctic sectors
- Divide AIS into sectors
- For each sector in turn (and for some combinations), apply extreme depth-dependent melt forcing
  - No melt for h < 100m
  - Range up to 400m/a where h > 800m.
  - No melt applied in partially-grounded cells



• Run for 1000 years, compare with control (no melt).



Martin, D. F., Cornford, S. L., & Payne, A. J. (2019). Millennial-scale vulnerability of the Antarctic Ice Sheet to regional ice shelf collapse. *Geophysical Research Letters*, 46, 1467–1475.

https://doi.org/10.1029/2018GL081229







#### **Antarctic Vulnerability results:**





### Sector 5 (Weddell Sea/Ronne Ice Shelf)







### **Regional Independence**

 Resource limitations often force models to look at individual sectors/drainage basins

• Relies on the assumption of regional independence

• Can look at combinations of sectors to see if they behave independently...



Change in VaF vs. Time, sectors 2 and 4

Change in VaF vs. Time, sectors 2 and 5



- Yellow, Blue single sectors
- Purple combination
- Green sum of the two single-sector runs
- For WAIS sectors, roughly independent at start, after O(200a), start to interact



#### Summary

- First fully-resolved, systematic study of millennial-scale ice sheet response to regional ice shelf collapse based on 14 drainage basins.
- Sustained ice-shelf loss in **any** of the Amundsen Sea, Ronne, or Ross sectors can lead to wholesale West Antarctic collapse.
- Even with extreme forcing, loss is relatively modest for the initial century, increasing markedly afterward in West Antarctic collapse scenarios.
- Results indicate that Antarctic drainage basins are dynamically independent for 1-2 centuries, after which dynamic interactions between basins become increasingly important (and regional modeling results will be increasingly inaccurate).
- Combination of AMR and NERSC resources made this possible 35,000 years of fully-resolved full-continent Antarctic simulation.



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## Thank you!



