

Short spatial and temporal scales in the terrestrial cryosphere



Photo: Kaskawulsh Glacier, St. Elias Mountains, Yukon, Canada (Credit: Canadian Astronaut David Saint Jacques)

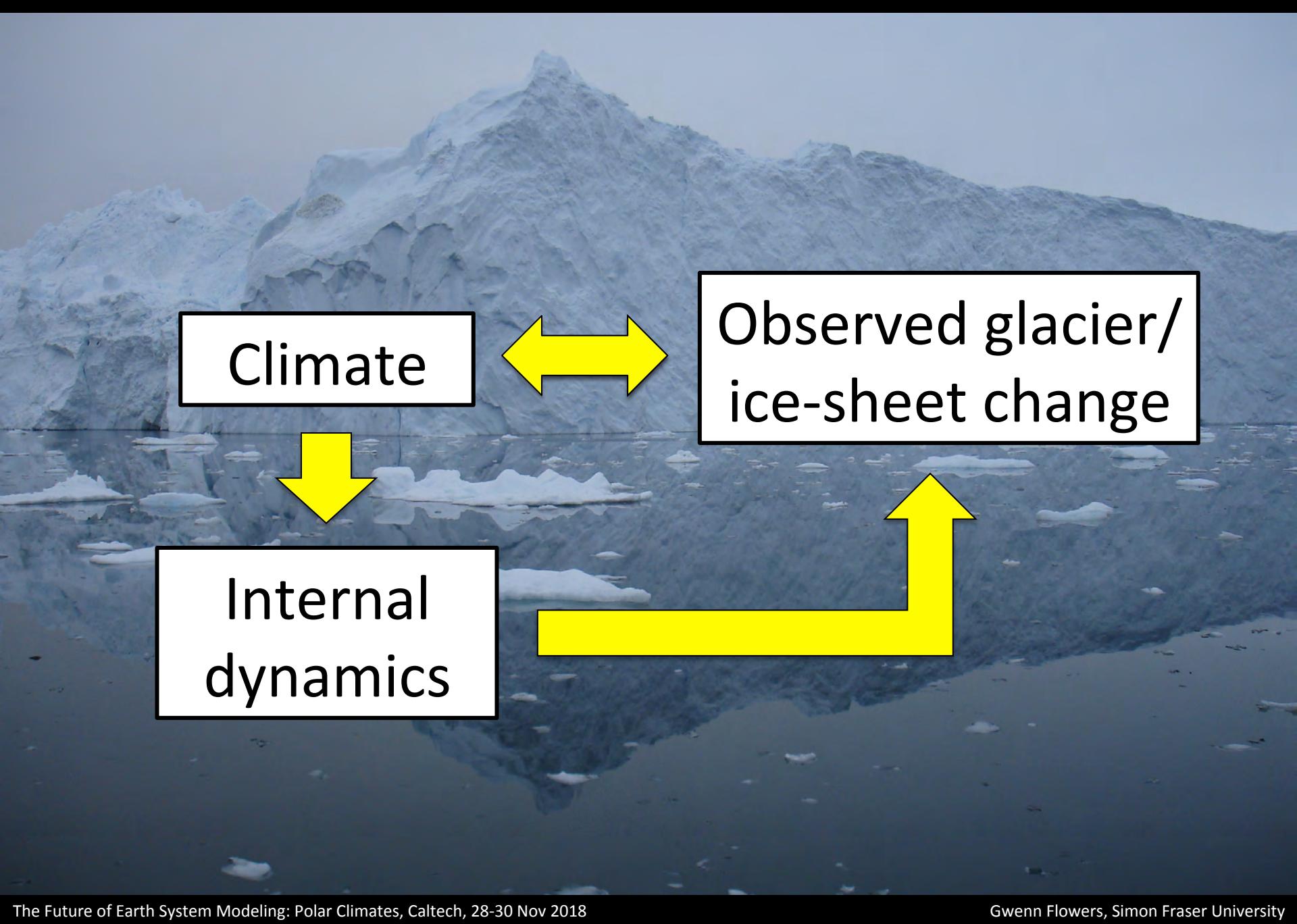
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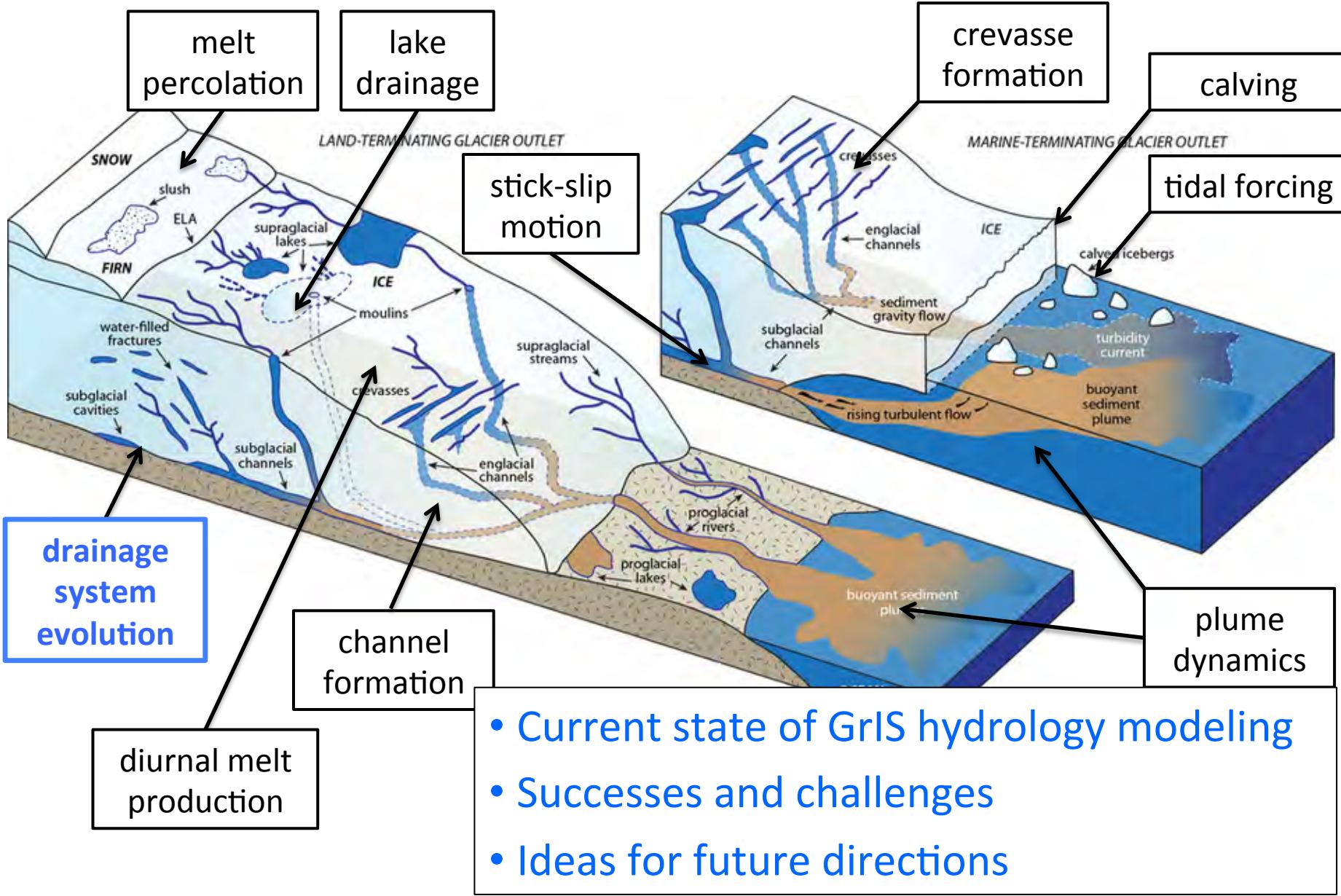
Canada Research Chairs
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Motivation

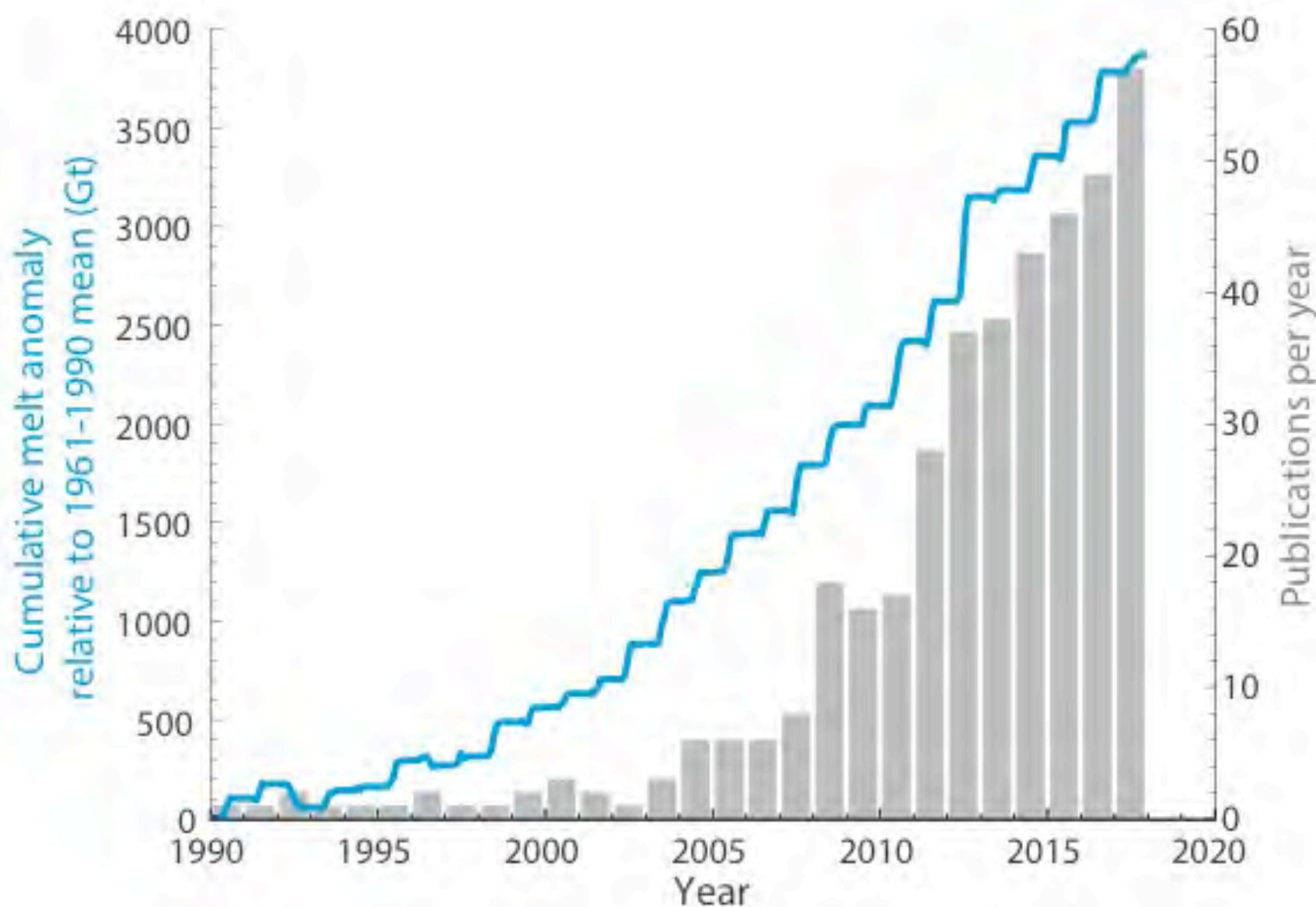


Examples: processes characterized by short spatial / temporal scales



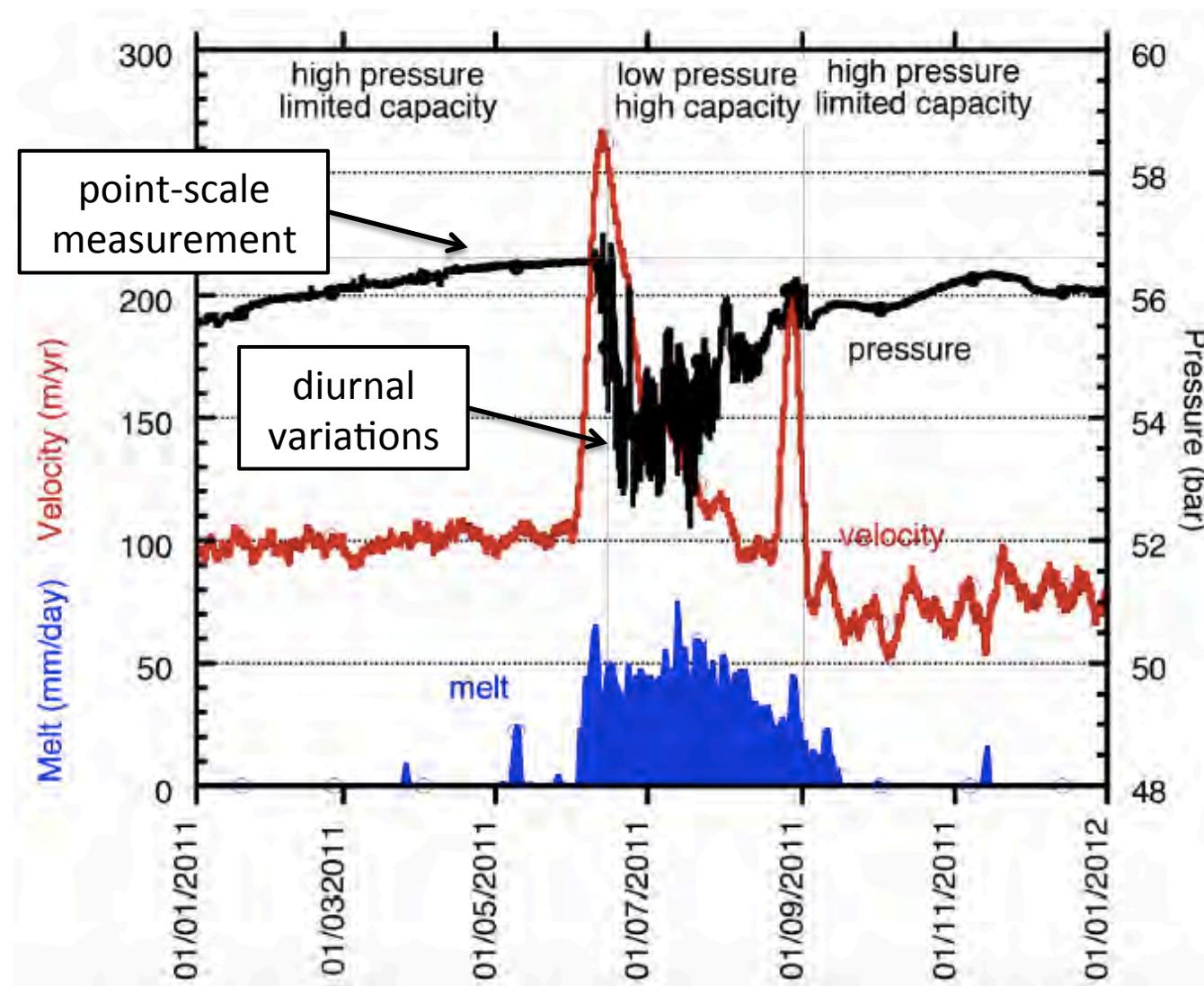
Chu, V.W. (2014). [Greenland Ice Sheet hydrology: a review](#). *Progress in Physical Geography*, 38(1): 19–54, doi:10.1177/0309133313507075

Literature: Greenland ice-sheet hydrology



Flowers, G.E. 2018. Hydrology and the future of the Greenland Ice Sheet, *Nature Communications*, Comment.

Influence of hydrology on Greenland ice-sheet dynamics

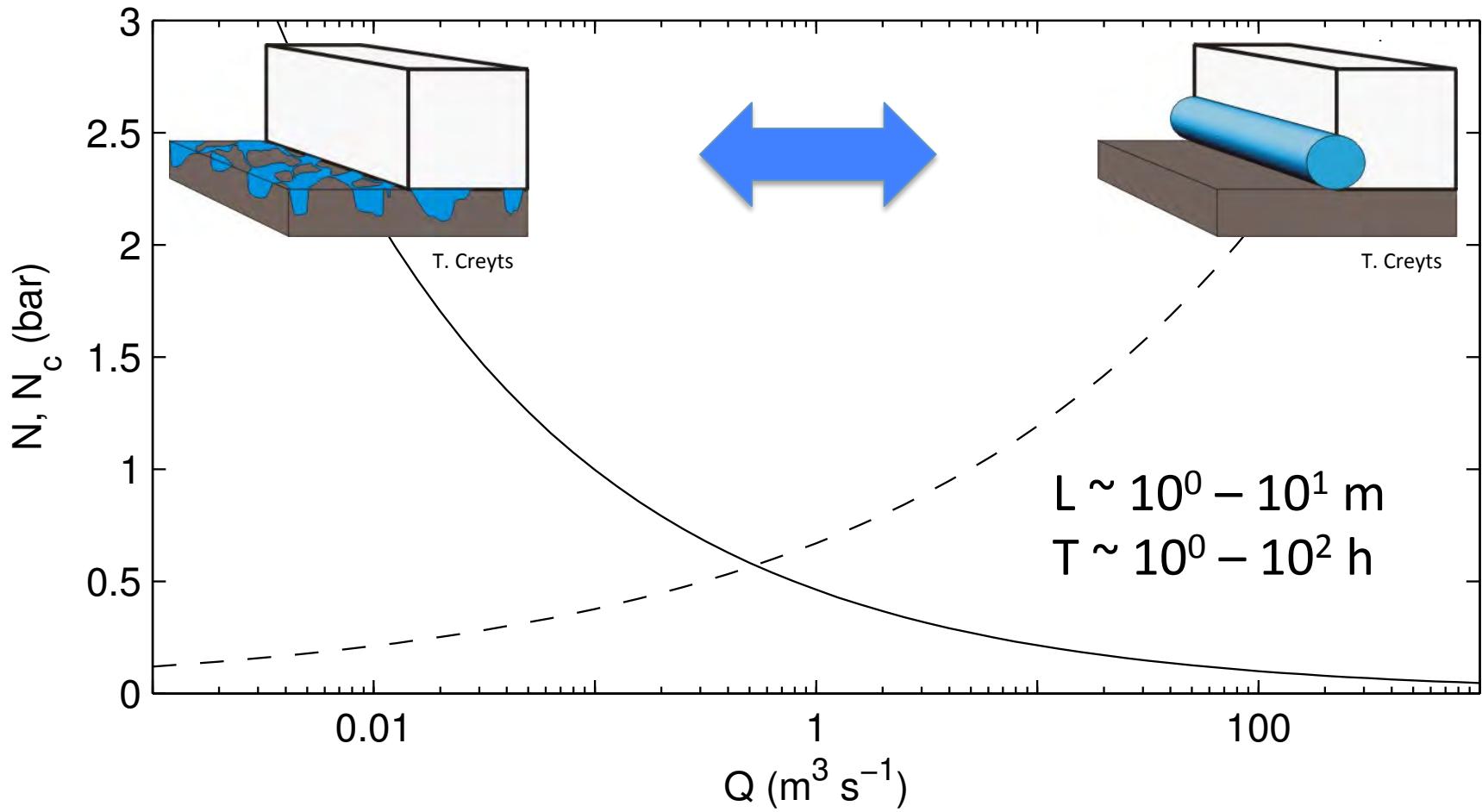


van de Wal et al (2015). Self-regulation of ice flow varies across the ablation area in south-west Greenland, *The Cryosphere*, 9, 603–611.

Subglacial drainage system morphology and evolution

Slow | Inefficient | Distributed

Fast | Efficient | Channelized



$$\text{Effective pressure } N = P_{\text{ice}} - P_{\text{water}}$$

Hewitt (2011). Modelling distributed and channelized subglacial drainage: the spacing of channels. *J. Glaciol.* 57, 302–314.

Recipe for a model of subglacial drainage

Flux

$$q = -K h^\alpha (\nabla \phi)^\beta$$

Fluid potential

$$\phi = P_w + \rho_w g z$$

Continuity

$$\frac{\partial h}{\partial t} + \nabla \cdot q = \dot{b}$$

Sources/sinks

$$\dot{b} = \dot{b}_s + \dot{b}_e + \dot{b}_a + \frac{Q_G + Q_F}{\rho_i L}$$

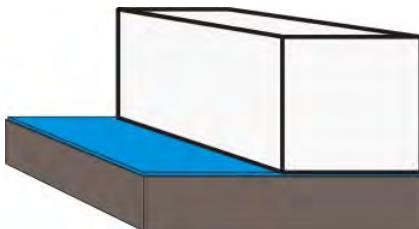
Evolution equation
for element(s)

$$\frac{\partial h'}{\partial t} = \text{opening} - \text{closure}$$

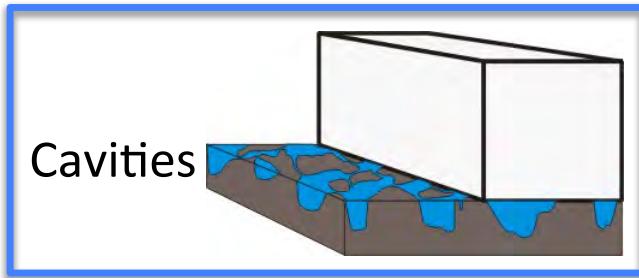
Elements of the subglacial drainage system

Slow | Inefficient | Distributed

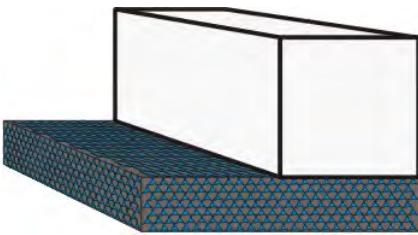
Sheets
& films



Cavities



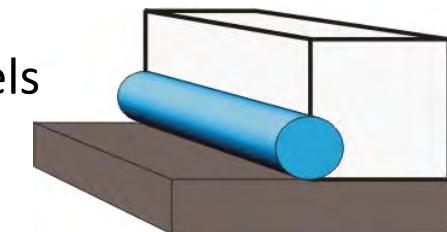
Porous
flow



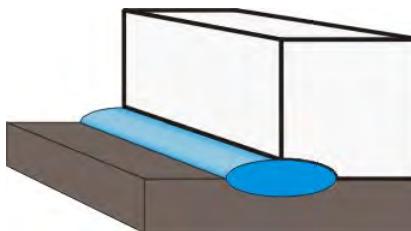
$$Q \uparrow \Rightarrow P \uparrow$$

Fast | Efficient | Channelized

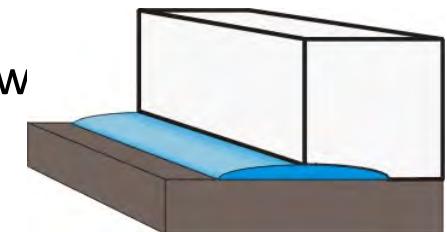
R-channels



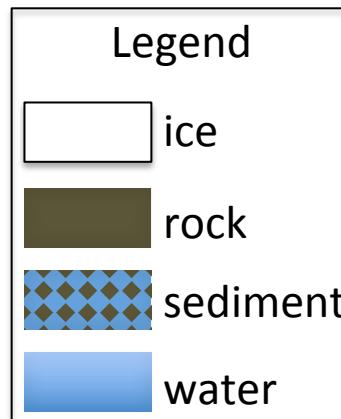
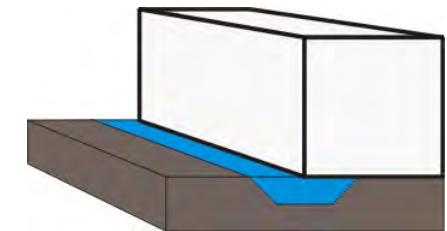
Canals



Broad/low
channels



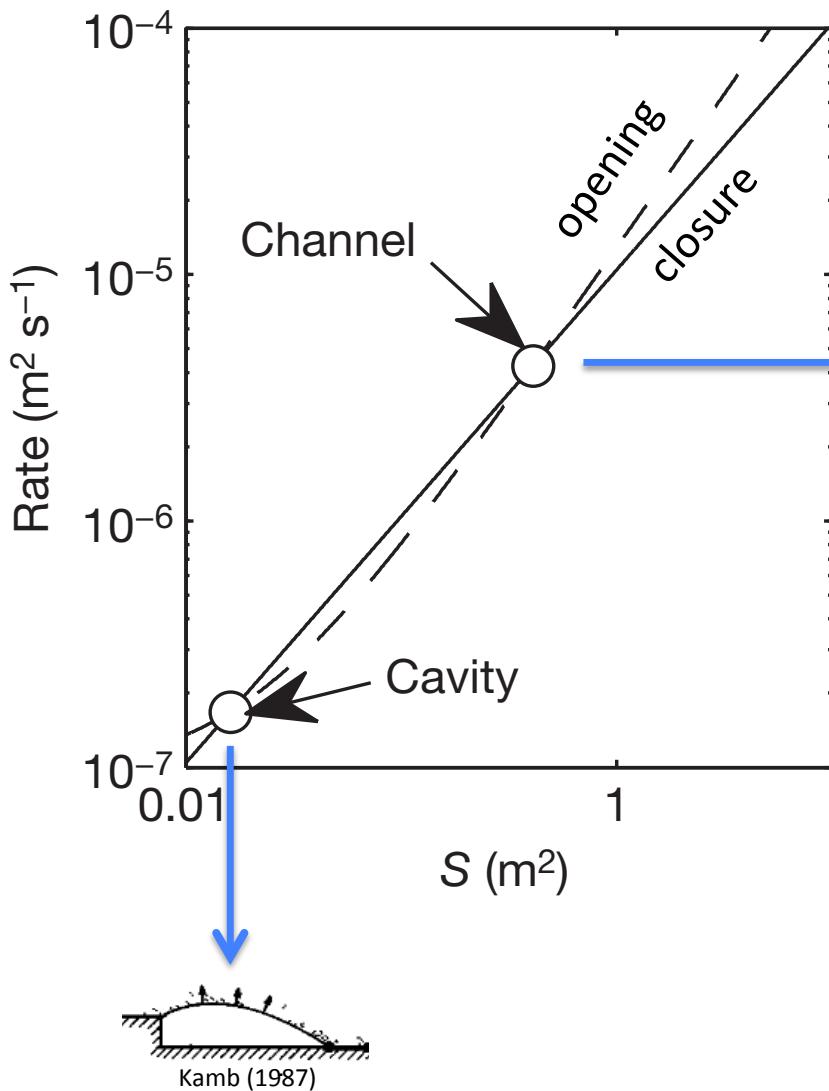
Nye
channels



$$Q \uparrow \Rightarrow P \downarrow$$

Diagrams courtesy of Tim Creyts

Coupled 2-D channel – cavity models

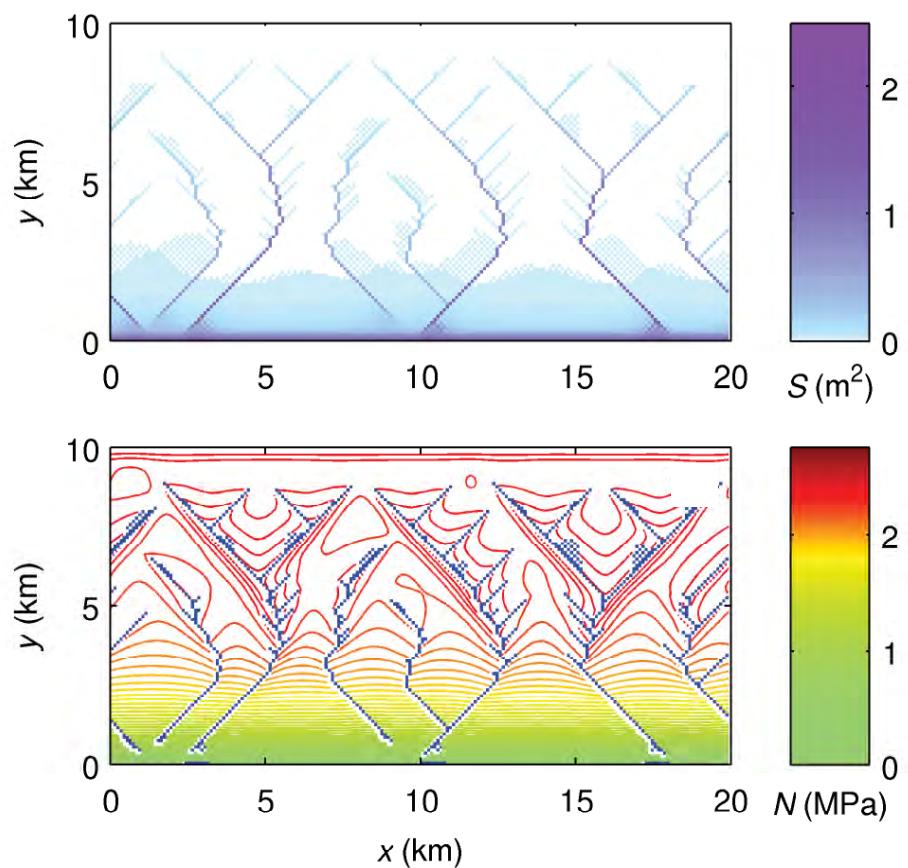
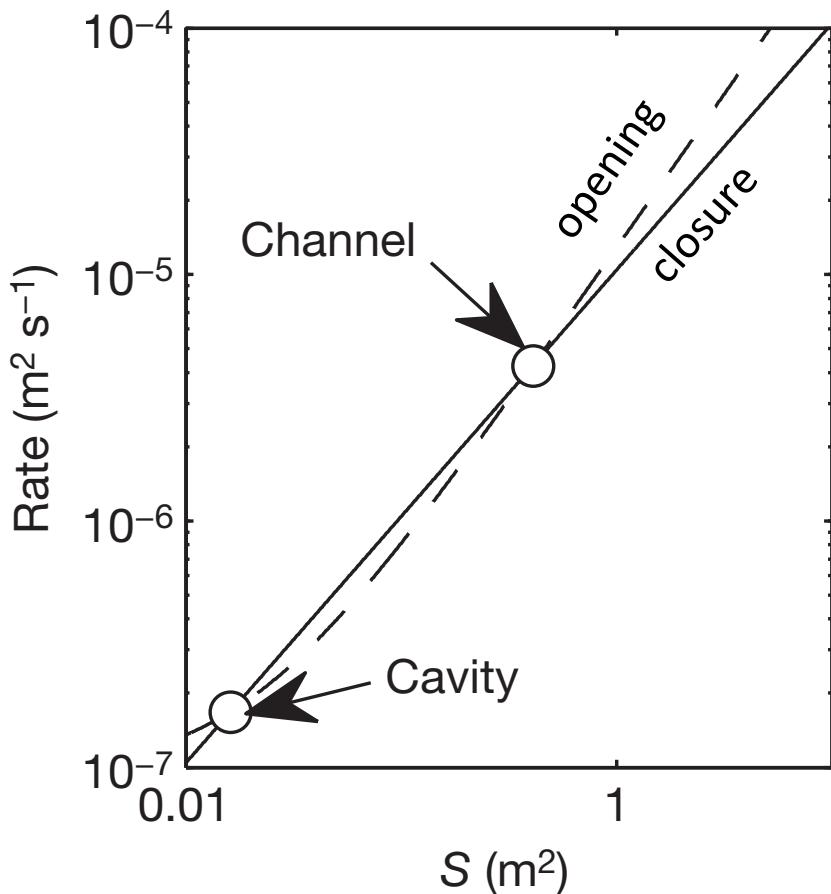


$$\frac{dS}{dt} = c_1 Q \Psi + u_b h - c_2 N^n S$$

$$Q_c = \frac{u_b h}{c_1(\alpha - 1)\Psi}$$

Schoof (2010): Ice-sheet acceleration driven by melt supply variability, *Nature*

Coupled 2-D channel – cavity models

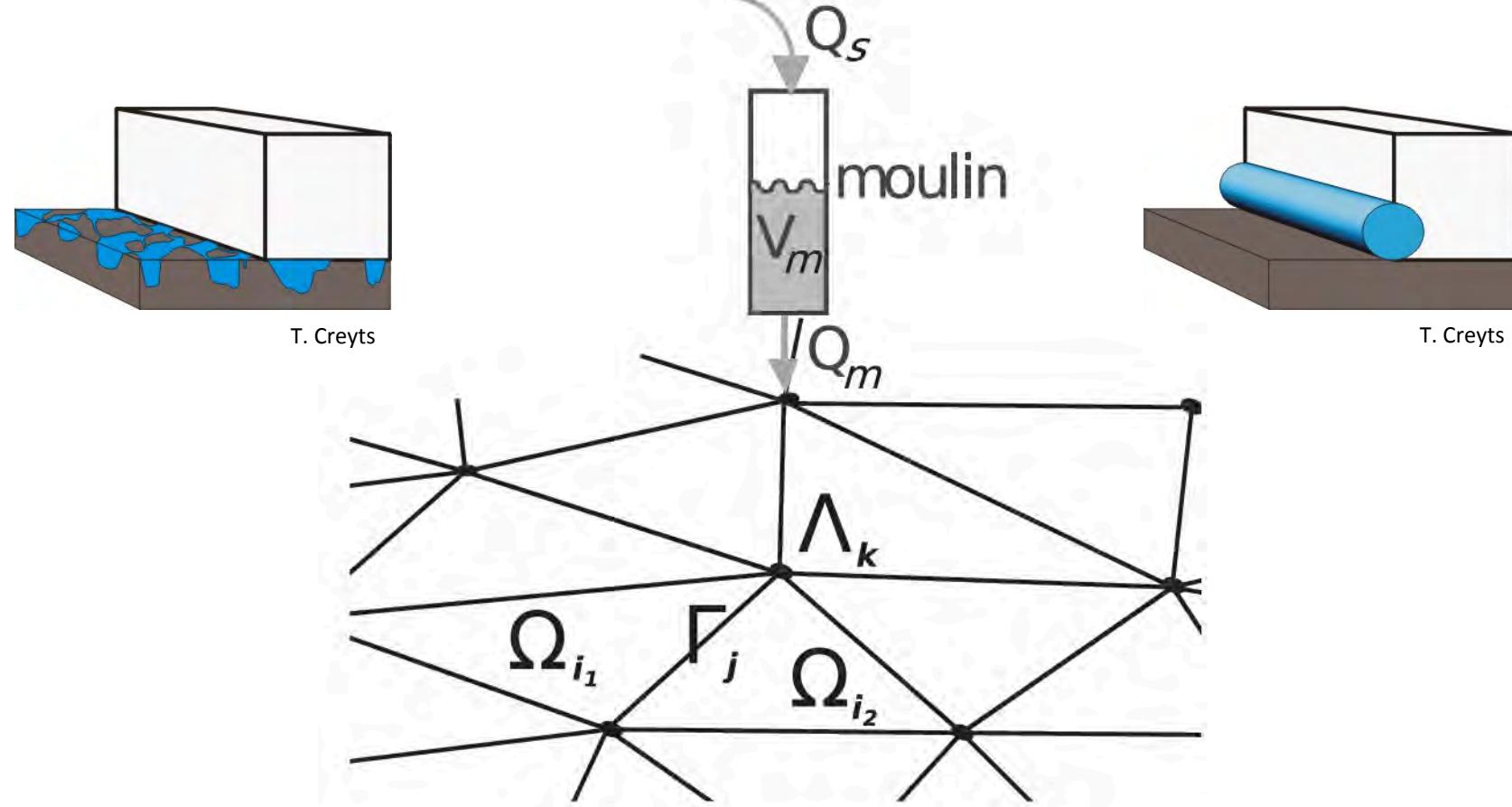


Flow element along each branch of lattice evolves into cavity or channel

Schoof (2010): Ice-sheet acceleration driven by melt supply variability, *Nature*

Coupled 2-D channel – cavity system models

Cavity system interacts with channel network defined along mesh edges



Governing equations for 2-D channel – cavity system model

Channel water balance

$$\frac{\partial Q}{\partial s} + \frac{\Xi - \Pi}{L} \left(\frac{1}{\rho_i} - \frac{1}{\rho_w} \right) - v_c - m_c = 0$$

Channel evolution

$$\frac{\partial S}{\partial t} = \frac{\Xi - \Pi}{\rho_i L} - v_c$$

Channel discharge

$$Q = -k_c S^{\alpha_c} \left| \frac{\partial \phi}{\partial s} \right|^{\beta_c - 2} \frac{\partial \phi}{\partial s}$$

Channel melt opening

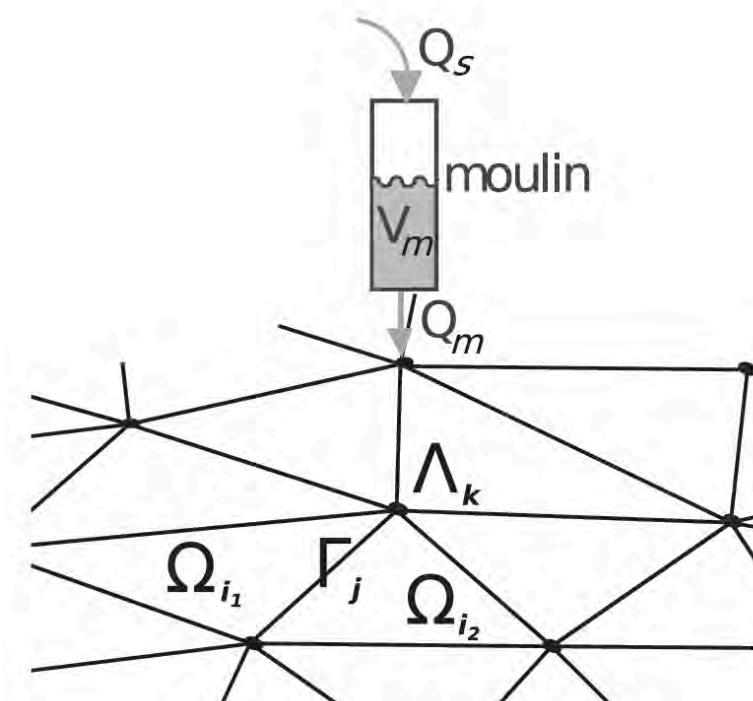
$$\Xi(S, \phi) = \left| Q \frac{\partial \phi}{\partial s} \right| + \left| l_c q_c \frac{\partial \phi}{\partial s} \right|$$

Pressure melting

$$\Pi(S, \phi) = -c_t c_w \rho_w (Q + f l_c q_c) \frac{\partial \phi - \partial \phi_m}{\partial s}$$

Channel closure by creep

$$v_c(S, \phi) = \frac{2}{n^n} A S |N|^{n-1} N$$



Governing equations for 2-D channel – cavity system model

Cavity system water balance

$$\frac{e_v}{\rho_w g} \frac{\partial \phi}{\partial t} - \nabla \cdot \mathbf{q} + w_s - v_s - m_b = 0$$

Cavity evolution

$$\frac{\partial h}{\partial t} = w_s - v_s$$

Cavity water flux

$$\mathbf{q} = -kh^\alpha |\nabla \phi|^{\beta-2} \nabla \phi$$

Cavity opening by sliding

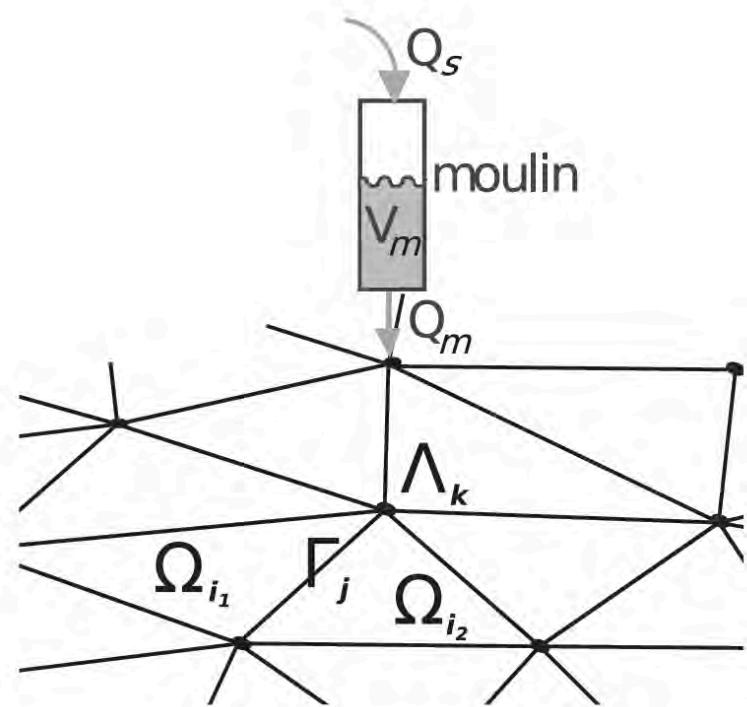
$$w_s(h) = \frac{|\mathbf{u}_b|}{l_r} (h_r - h)$$

Cavity closure by creep

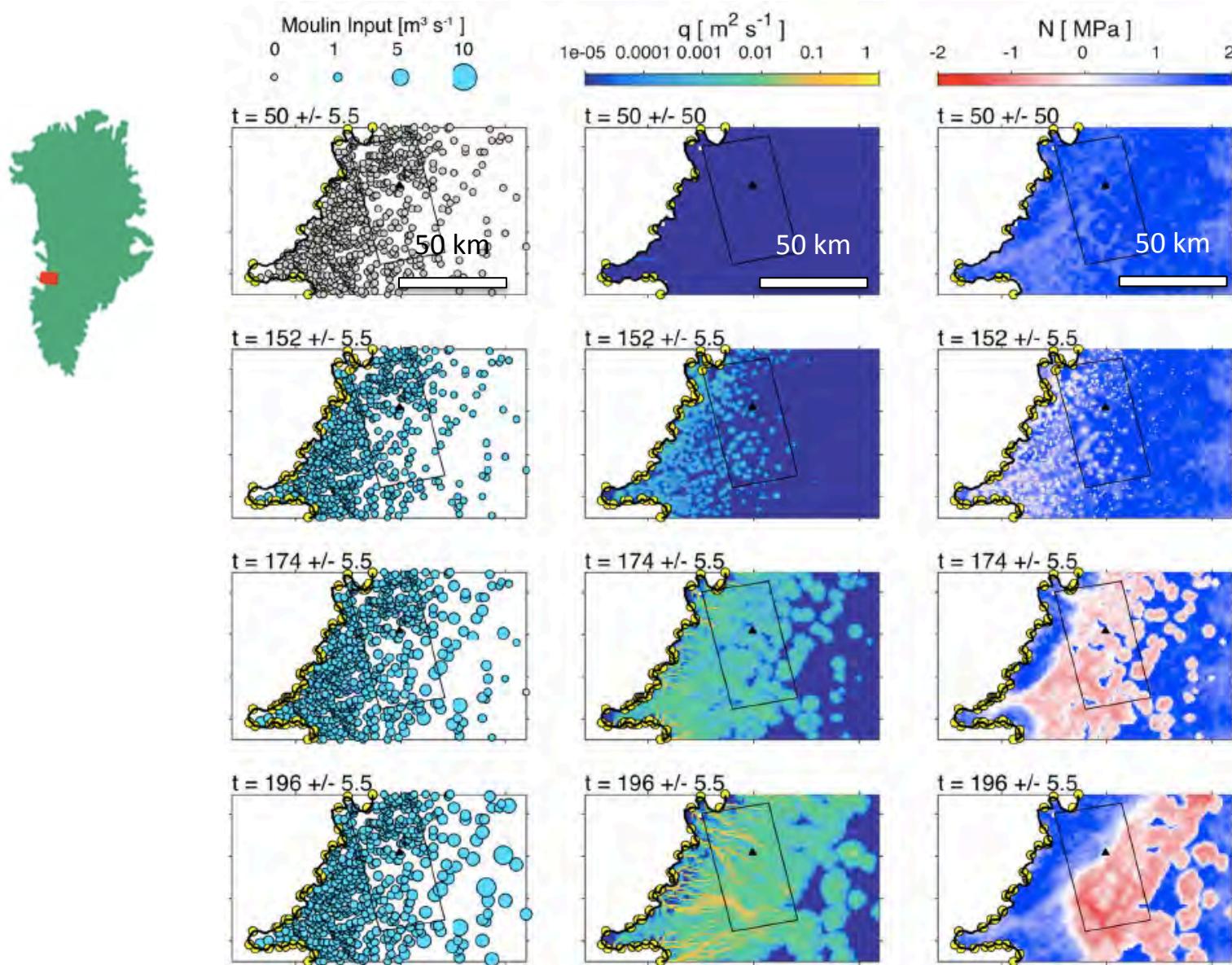
$$v_s(h, \phi) = \frac{2}{n^n} Ah |\mathcal{N}|^{n-1} N$$

Coupling with ice dynamics

$$\tau_b + \frac{CN_+ |\mathbf{u}_b|^{(1/n-1)}}{(|\mathbf{u}_b| + C^n A_s N_+^n)^{1/n}} \mathbf{u}_b = 0$$



Application of coupled 2-D channel – cavity system models



Stevens et al (2018). Relationship between Greenland ice sheet surface speed and modeled effective pressure. *Journal of Geophysical Research*, 123, 2258–2278.

Strengths of current models

- Correct **physics** applied to fast and slow drainage systems
- **Numerical** formulation: 2D distributed system + 1D channel network
- Dynamic **evolution** of drainage system
- Basic **coupling** with ice-flow models
- Application to real **topography**

Modeling challenges and limitations (short list)

Coupling: Two-way coupling with ice-flow models remains rare

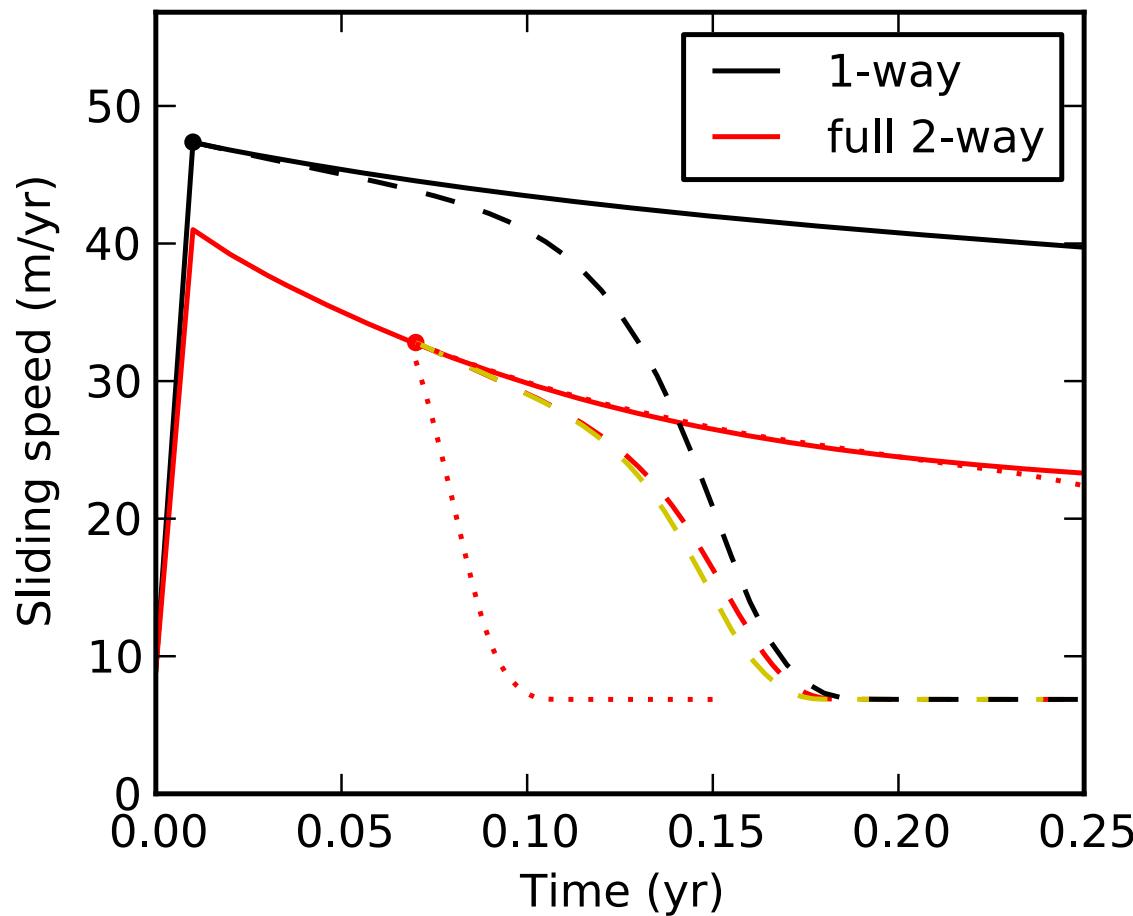
Physics:

- Most conceptual models limited to cavity – channel systems
- Assumption of fully “connected” drainage system
- Pervasive/persistent temperate bed assumption

Numerics: Need for channel-resolving mesh

Data: Dearth of tuning / evaluation data

Importance of two-way coupling between hydrology and sliding



$$\rightarrow u_b = u_b(N)$$
$$\leftarrow \frac{\partial h}{\partial t} = \frac{\partial h}{\partial t}(u_b)$$

Two-way coupling => significant negative feedback

Unified governing equations for efficient/inefficient drainage

Basal “gap” evolution

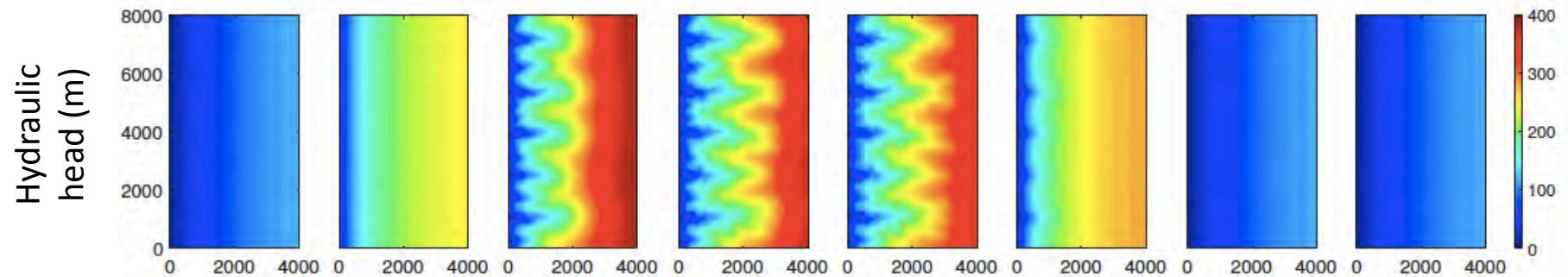
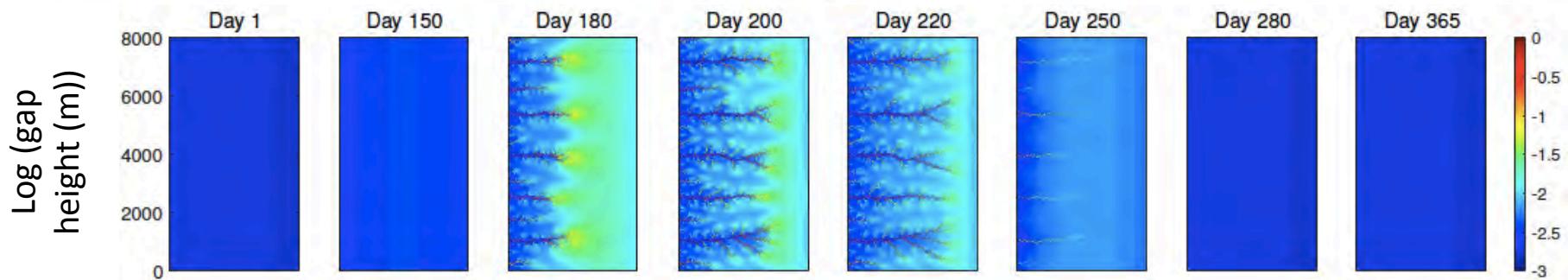
$$\frac{\partial b}{\partial t} = \frac{\dot{m}}{\rho_i} + \beta u_b - A|p_i - p_w|^{n-1}(p_i - p_w)b$$

Water flux

$$\mathbf{q} = \frac{-b^3 g}{12\nu(1 + \omega Re)} \nabla h$$

Water balance

$$\nabla \cdot (-\mathbf{K} \cdot \nabla h) + \frac{\partial e_v(h - z_b)}{\partial t} = \dot{m} \left(\frac{1}{\rho_w} - \frac{1}{\rho_i} \right) + A|p_i - p_w|^{n-1}(p_i - p_w)b - \beta u_b + i_{e \rightarrow b}$$

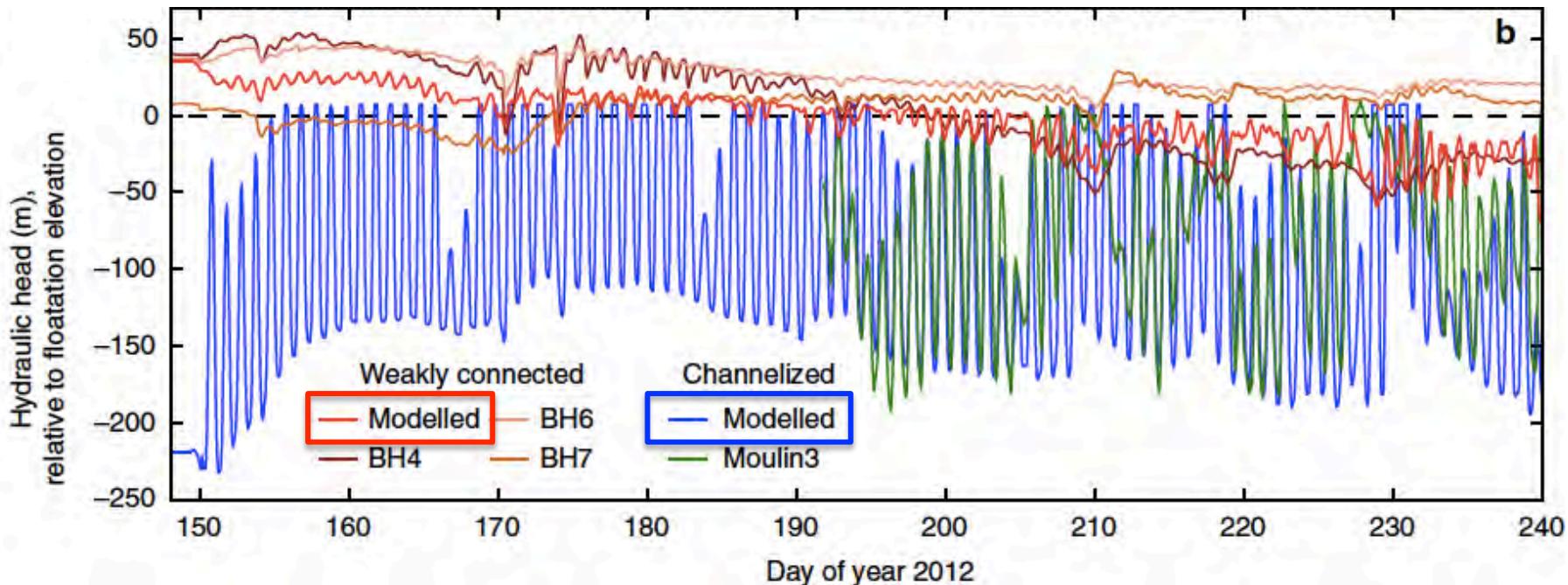
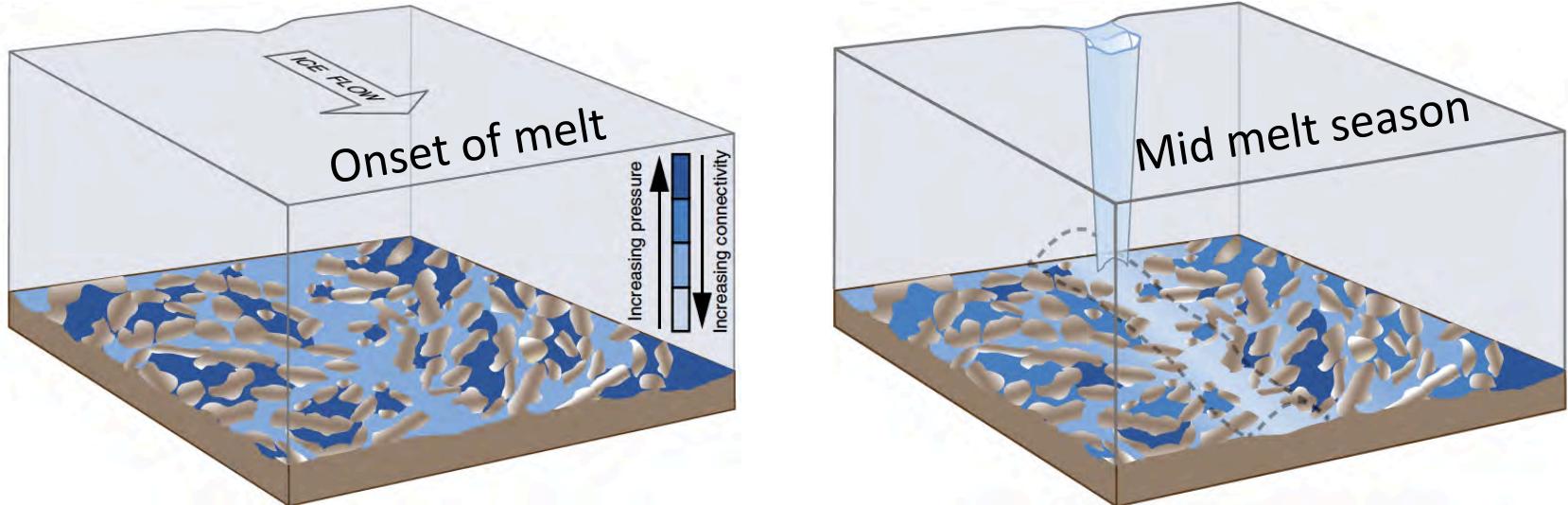


Sommers et al. (2018): SHaKTI: Subglacial Hydrology and Kinetic Transient Interactions v1.0, *Geoscientific Model Development*

The Future of Earth System Modeling: Polar Climates, Caltech, 28-30 Nov 2018

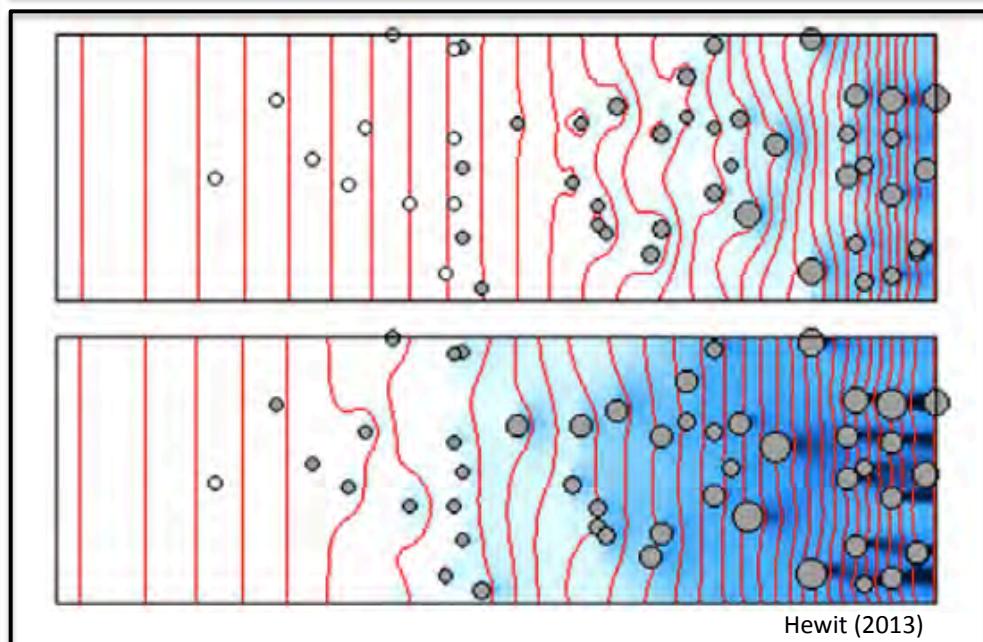
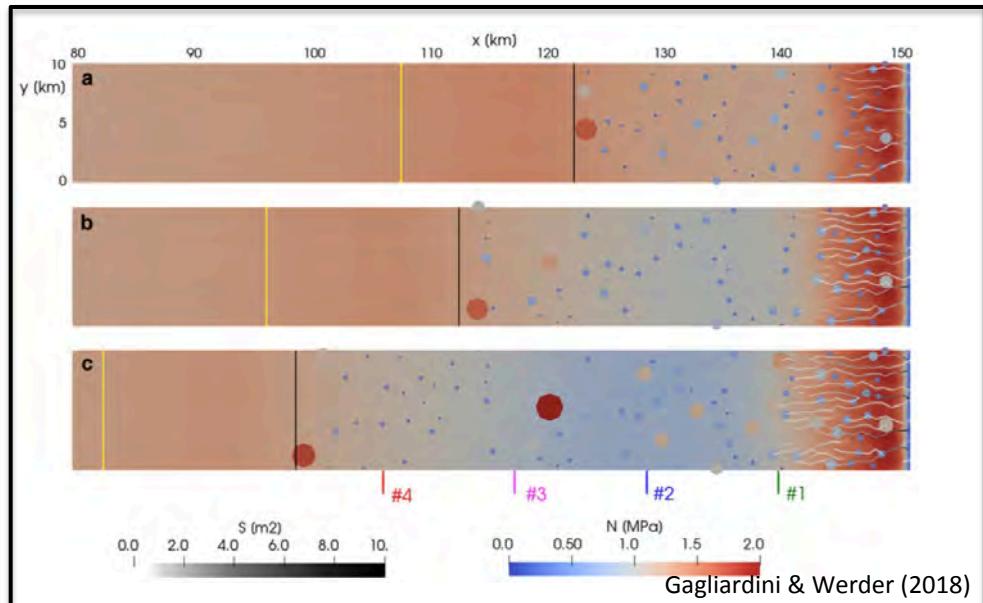
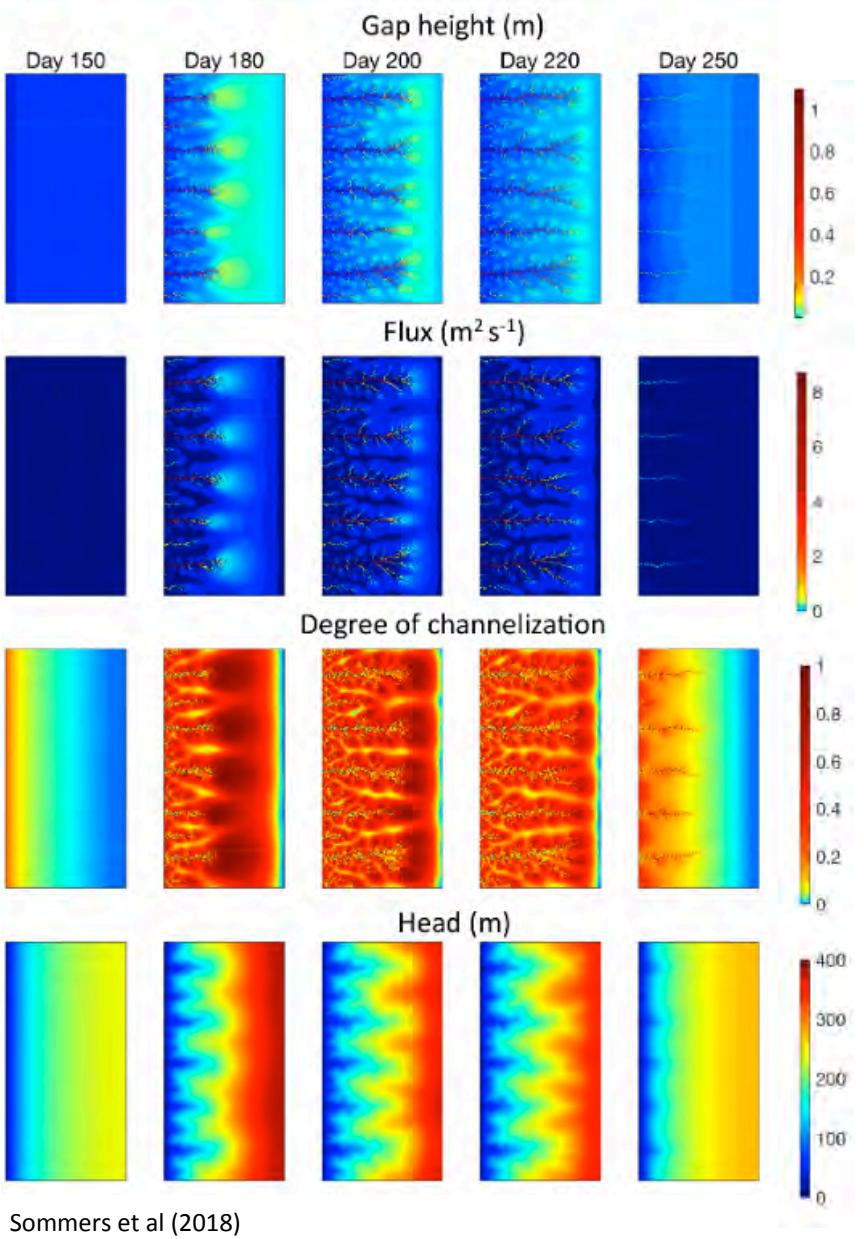
Gwenn Flowers, Simon Fraser University

Including the “weakly connected” bed

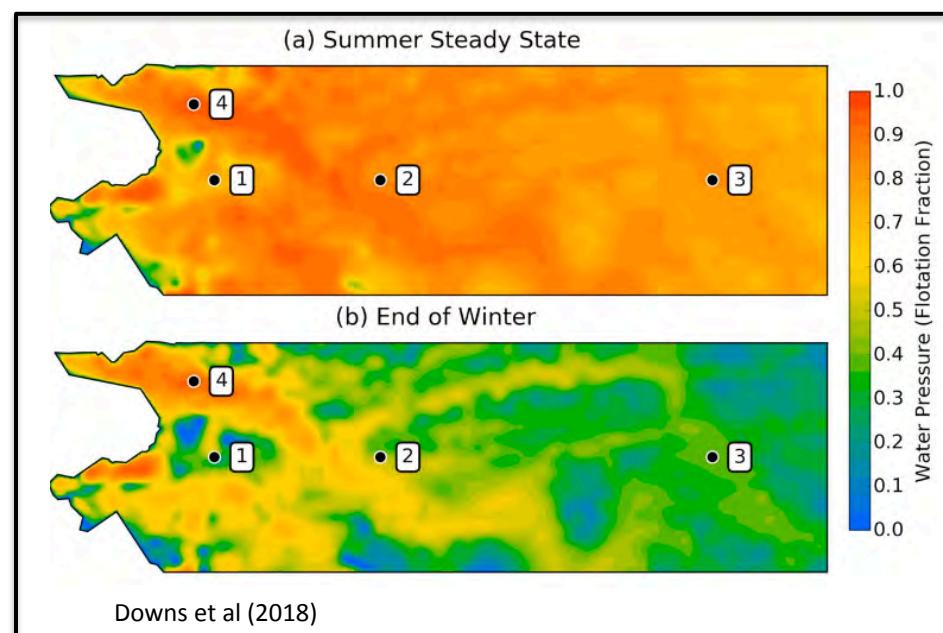
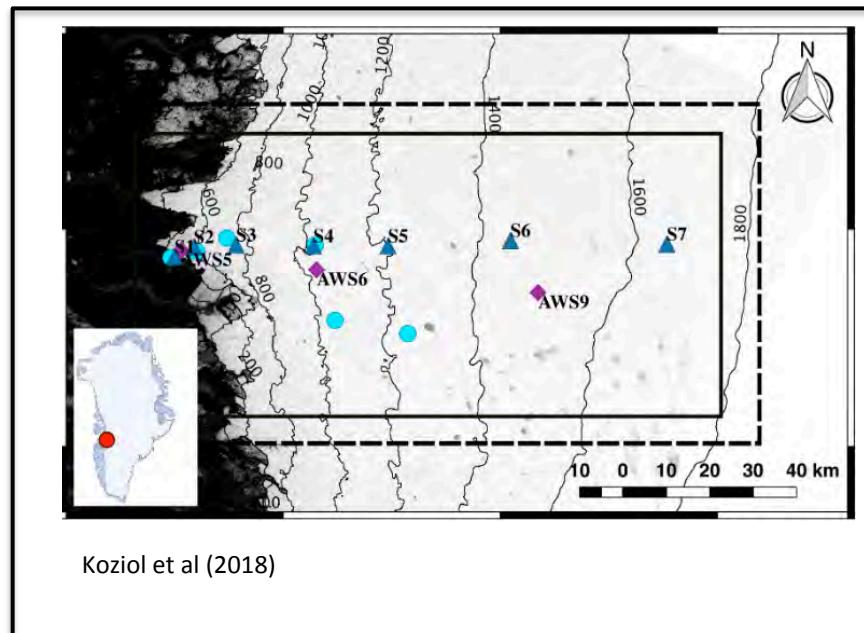
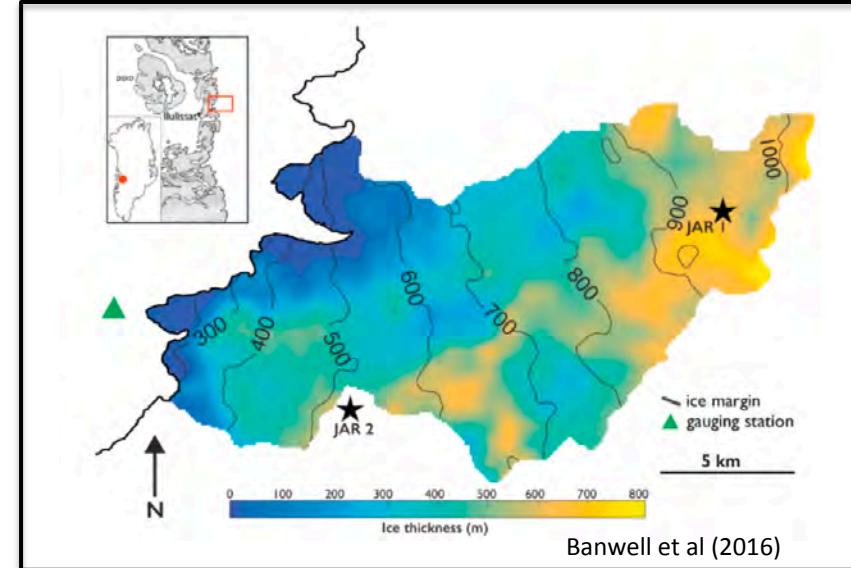
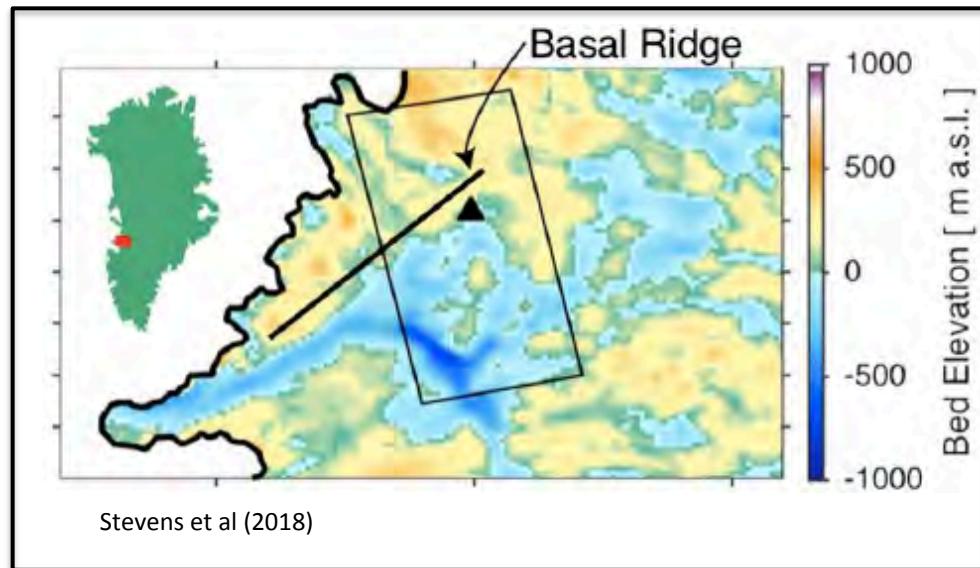


Hoffman et al. (2017): Greenland subglacial drainage evolution regulated by weakly connected regions of the bed, *Nature Communications*

Limitations of current models: application to synthetic topography



Limitations of current models: application to limited domains

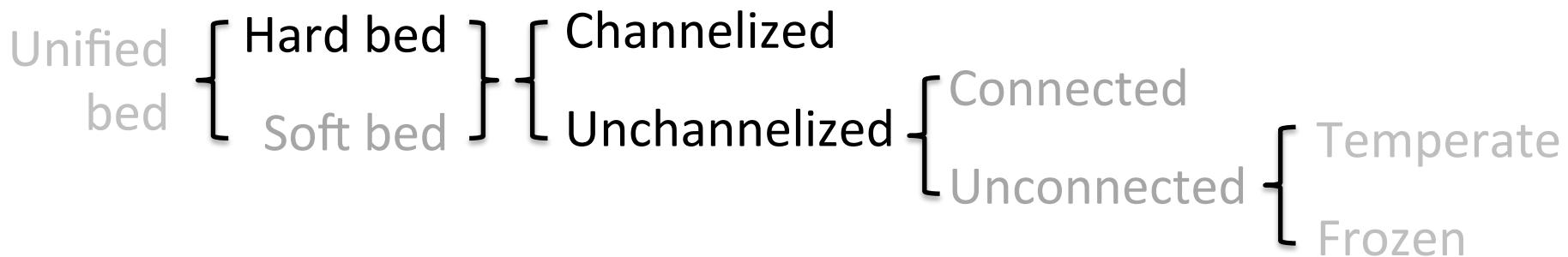
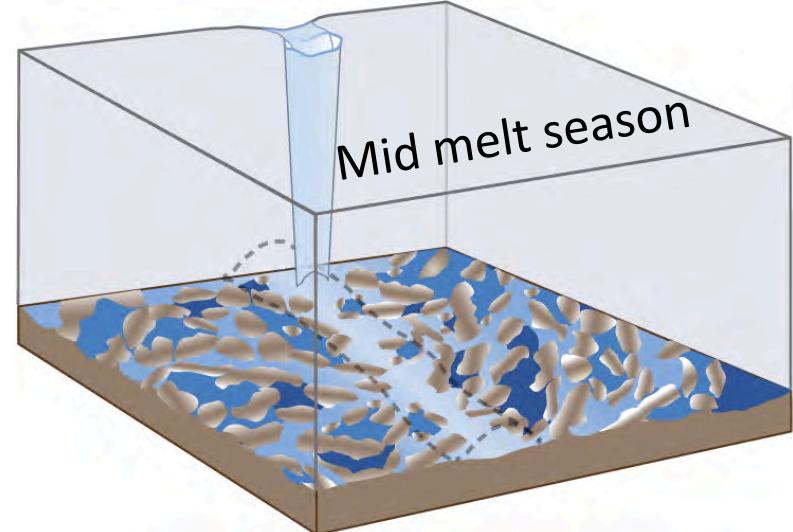
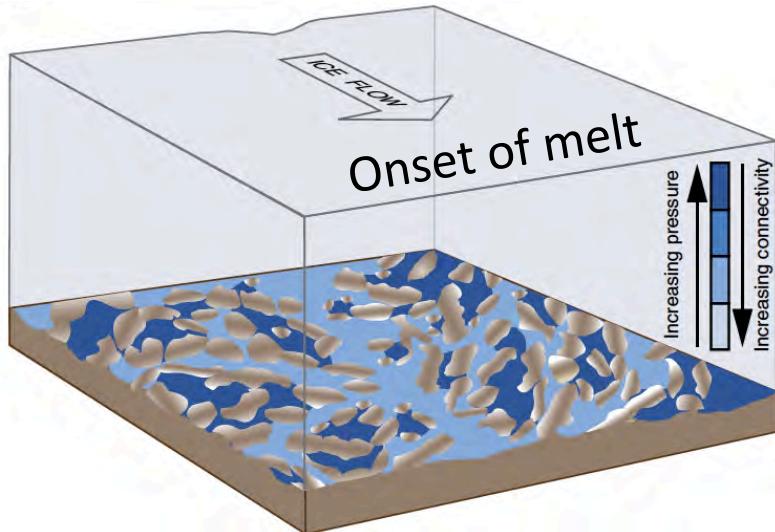


Modeling challenges and limitations (short list)

- Two-way coupling with ice-flow models remains rare
=> Feedback missing
- Most conceptual models limited to cavity – channel systems
=> Deforming bed behavior missing
- Assumption of fully “connected” drainage system
=> Models wrong in winter
- Pervasive/persistent temperate bed assumption
=> Mass / energy conservation
- Need for channel-resolving numerical mesh
=> Slow
- Dearth of tuning/evaluation data, resolution of input data
=> Calibration / validation impossible

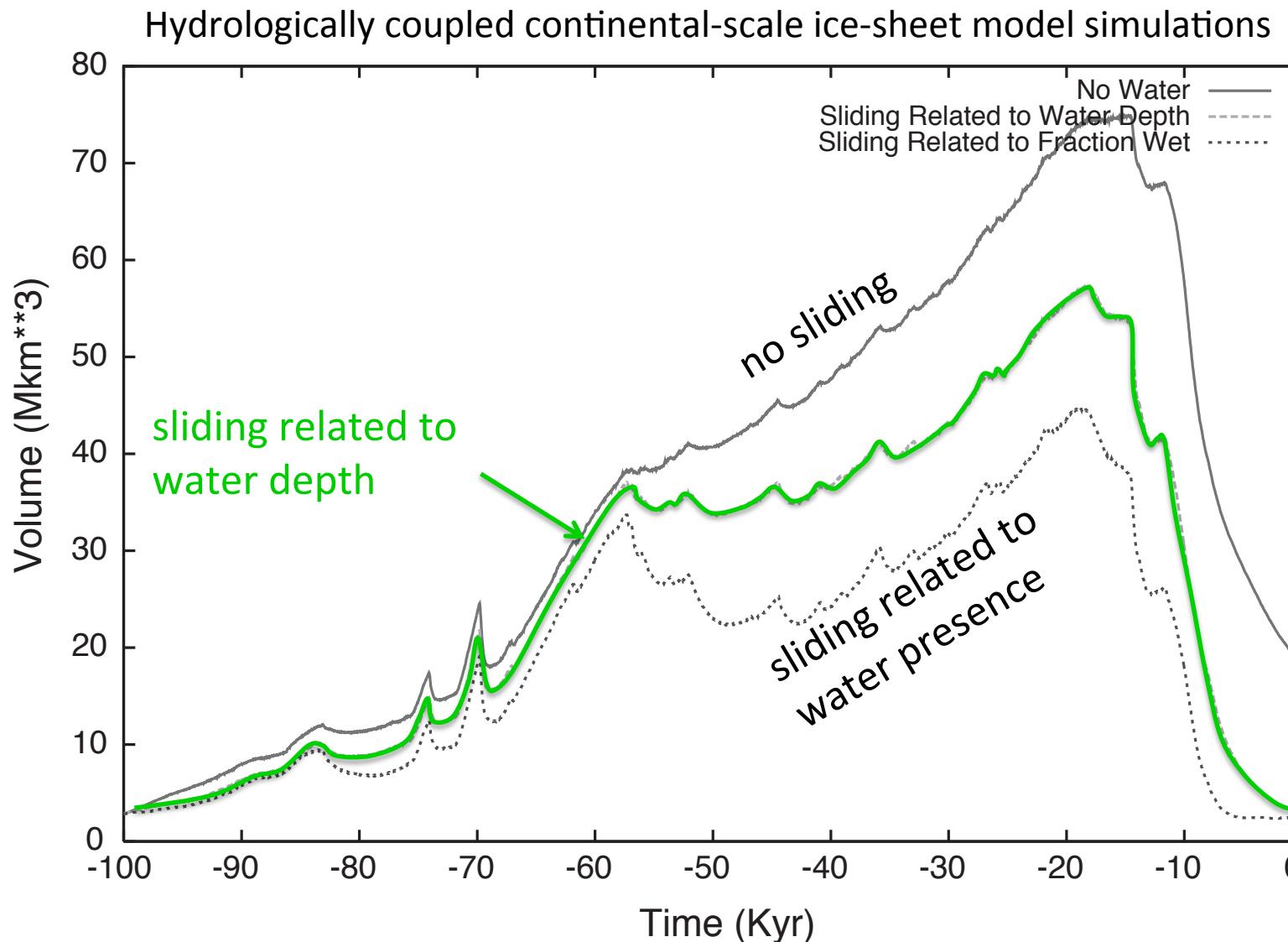
Ways forward to address modeling challenges & limitations

Add or better parameterize **missing physics**



Hoffman et al. (2017): Greenland subglacial drainage evolution regulated by weakly connected regions of the bed, *Nature Communications*

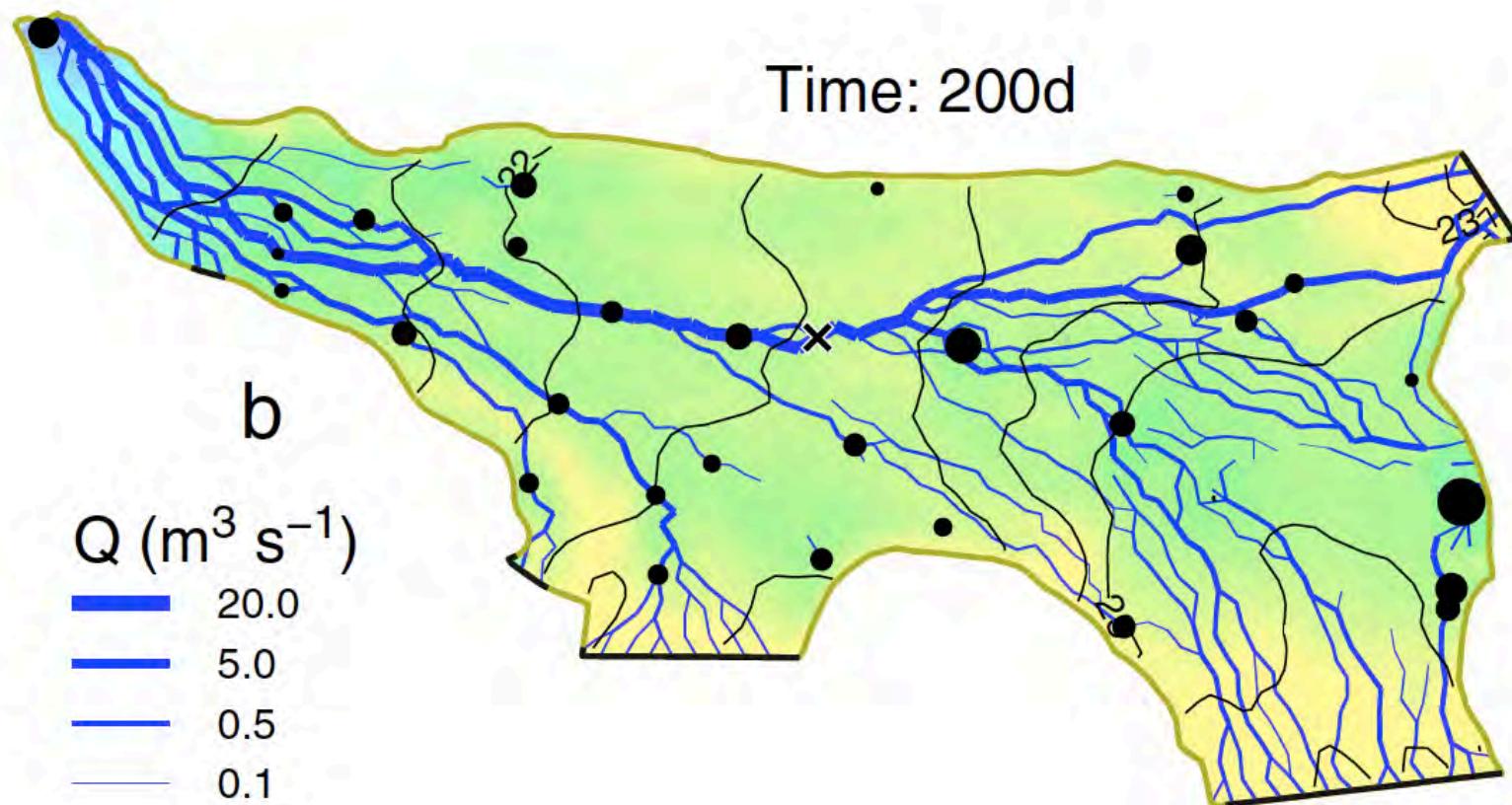
How do we get back to large-scale ice-sheet hydrology models?



Johnson and Fastook (2002): Northern Hemisphere glaciation and its sensitivity to basal melt water, *Quaternary International*

Ways forward to address modeling challenges & limitations

Build **statistical emulators** of physically based models (the **simulators**) to reduce computational burden



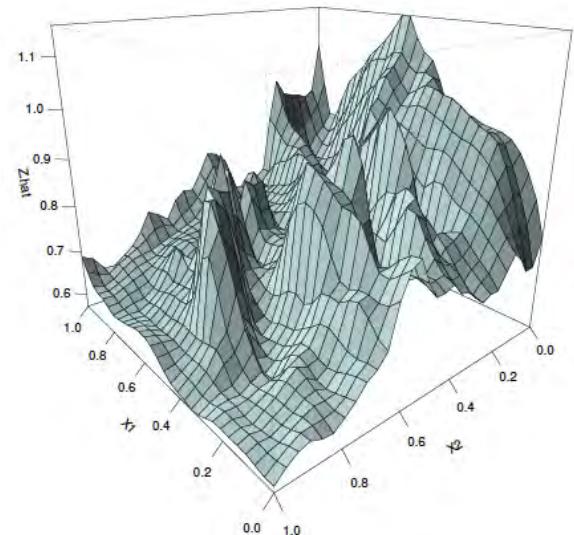
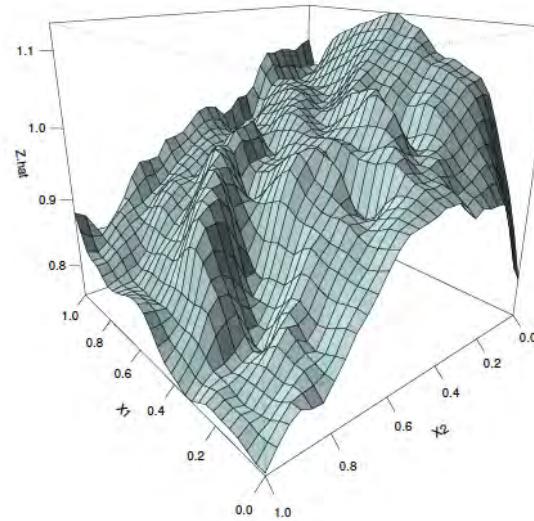
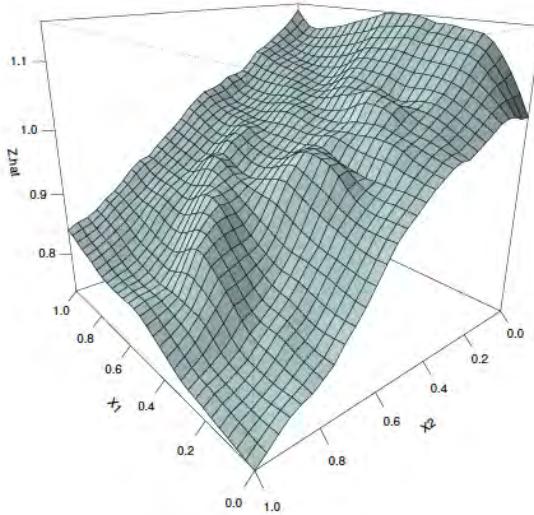
Werder et al (2013), Modeling channelized and distributed subglacial drainage in two dimensions, J. Geophys. Res. Earth Surf., 118, 2140–2158.

Ways forward to address modeling challenges & limitations

Build **statistical emulators** of physically based models (the **simulators**) to reduce computational burden

Example: **Gaussian Process model** to emulate glacier melt from physically based simulator model

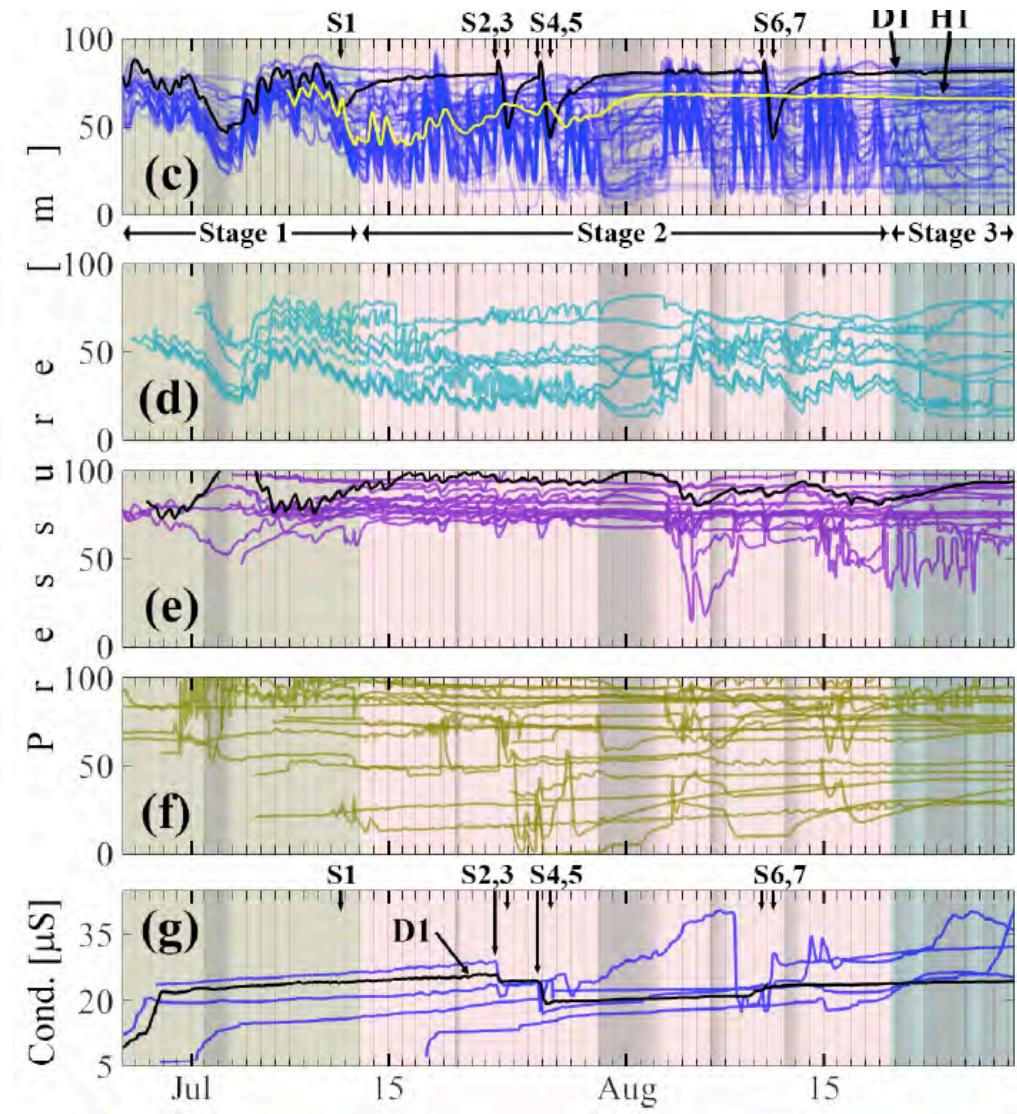
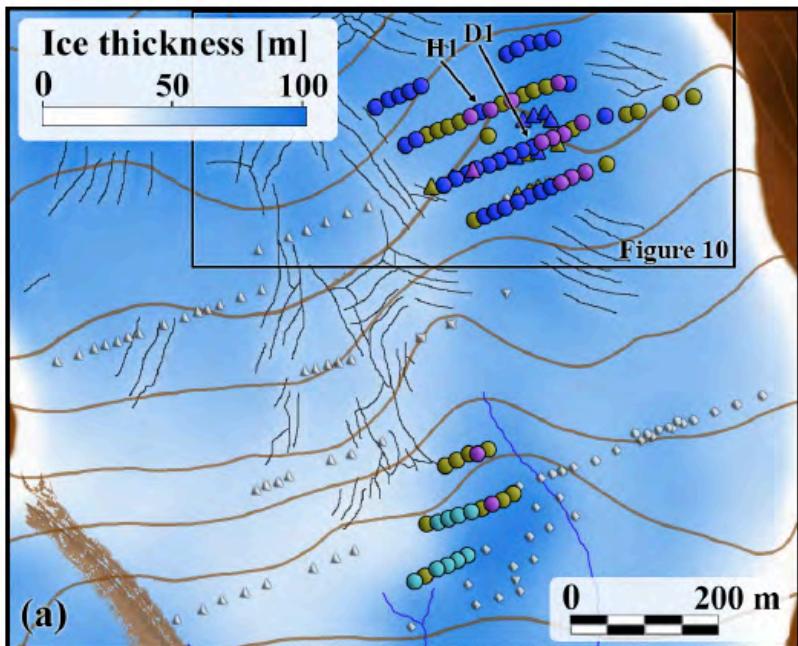
$$\hat{Z}(\mathbf{x}) = \mu + \mathbf{r}^\top(\mathbf{x})\mathbf{V}^{-1}(\mathbf{z} - \mu\mathbf{1})$$



Surjanovic, S., D. Bingham, G.E. Flowers (In prep). Using computer model uncertainty to determine optimal design of mass-balance stake networks.

Ways forward to address modeling challenges & limitations

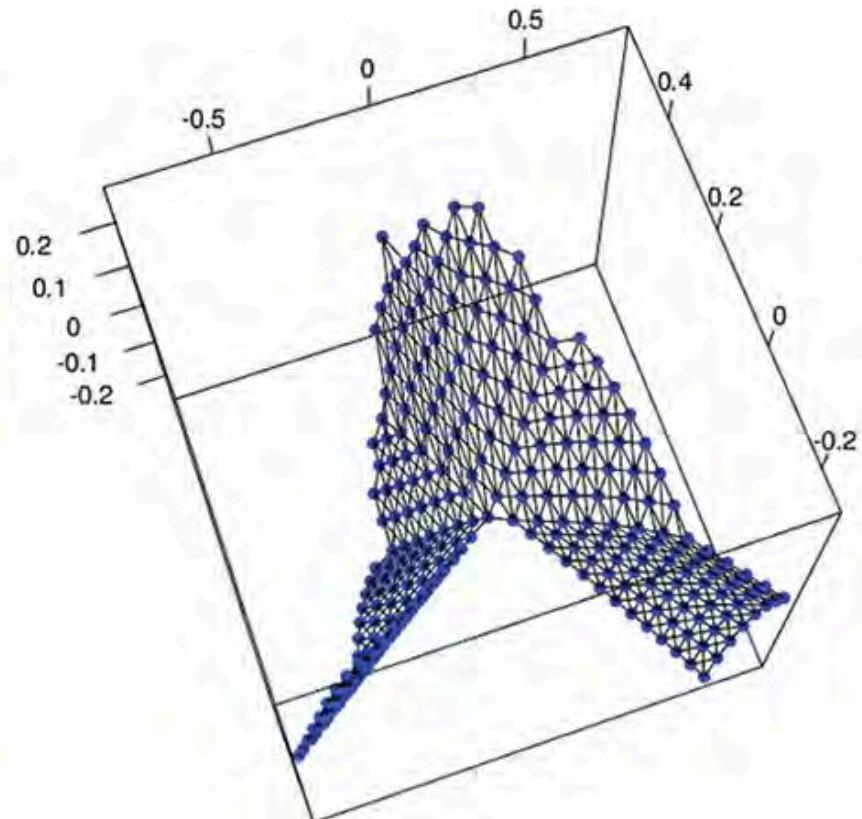
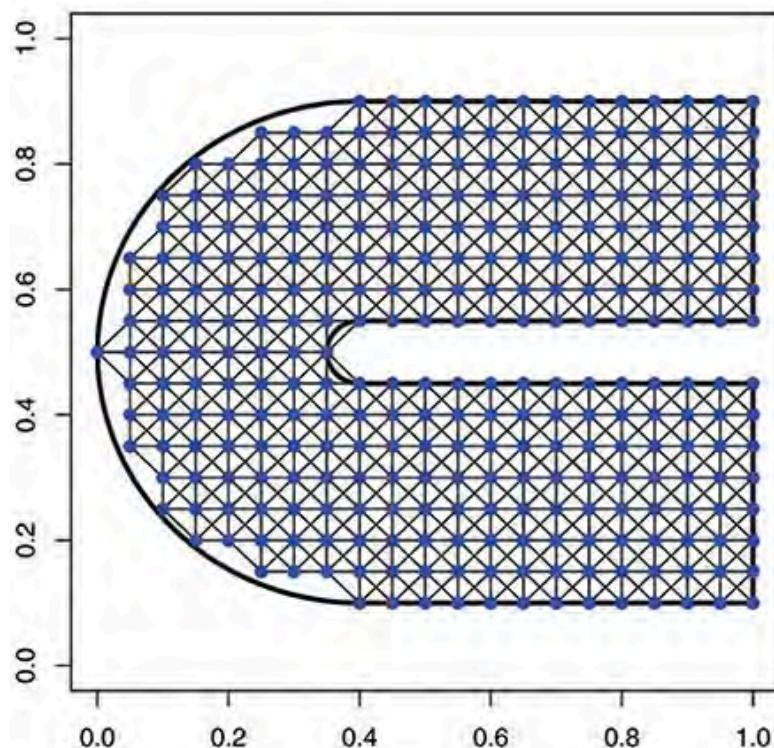
Failure of Euclidean-distance correlation: ask any borehole



Rada, C. and C.G. Schoof (Submitted), *The Cryosphere*.

Ways forward to address modeling challenges & limitations

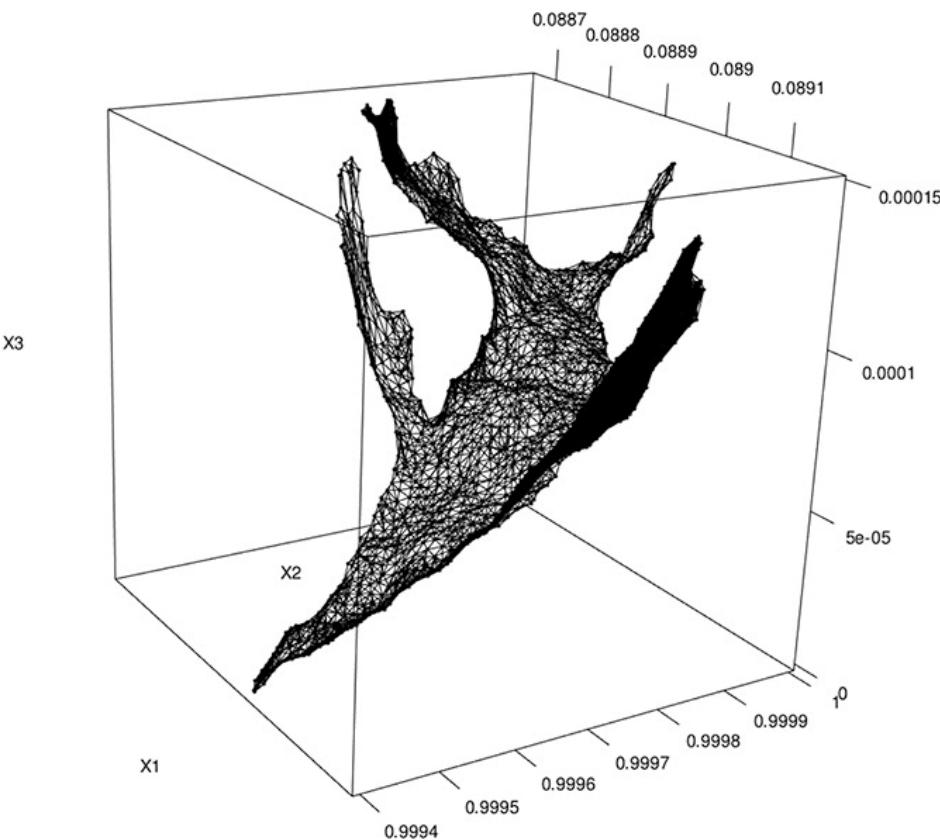
Example: Making use of [geodesic distance](#) in Gaussian Process model



Pratola, M.T., Harari, O., Bingham, D. and Flowers, G.E., 2017. Design and Analysis of Experiments on Nonconvex Regions. *Technometrics*, 59(1), pp.36-47.

Ways forward to address modeling challenges & limitations

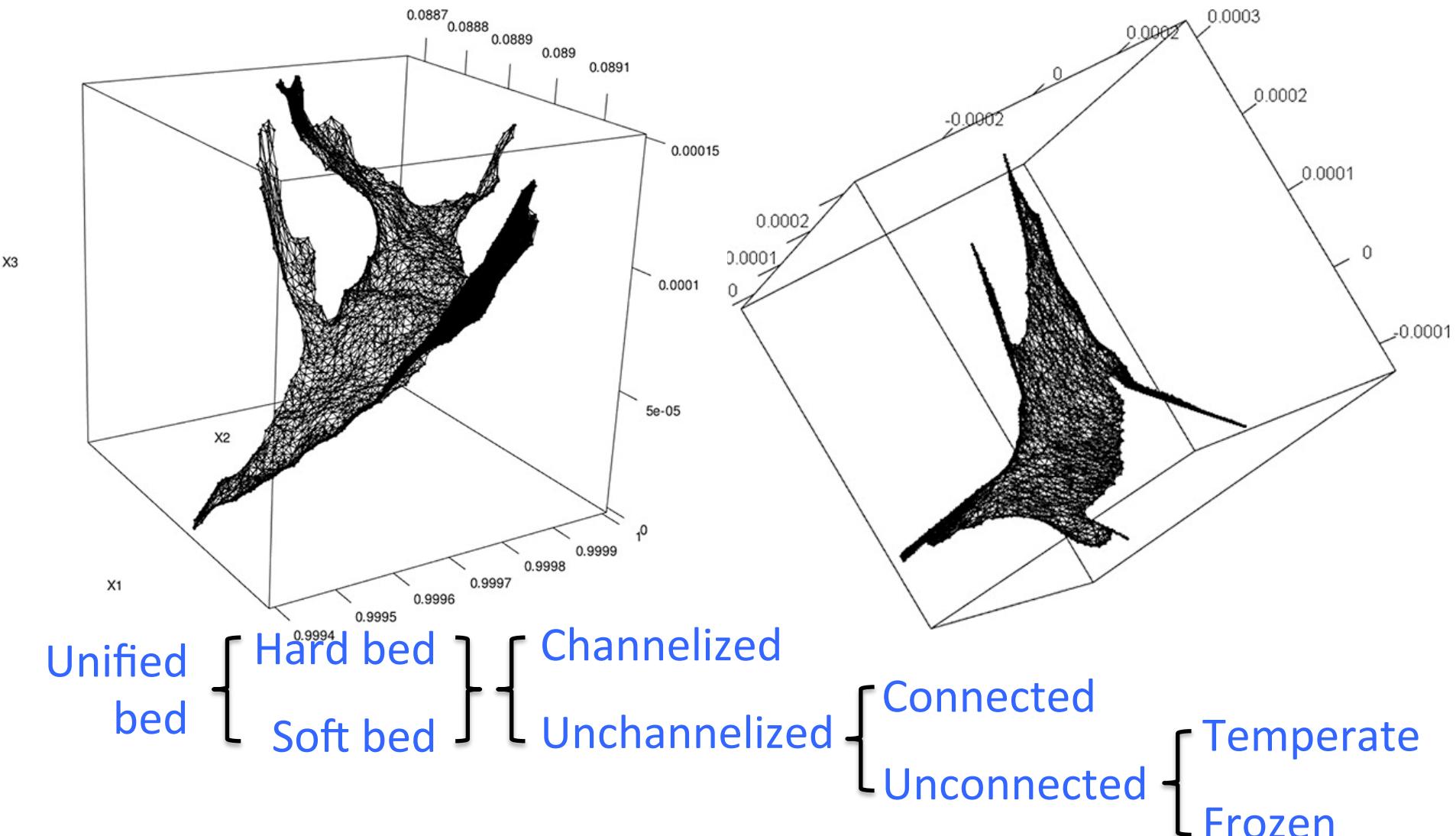
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Ways forward to address modeling challenges & limitations

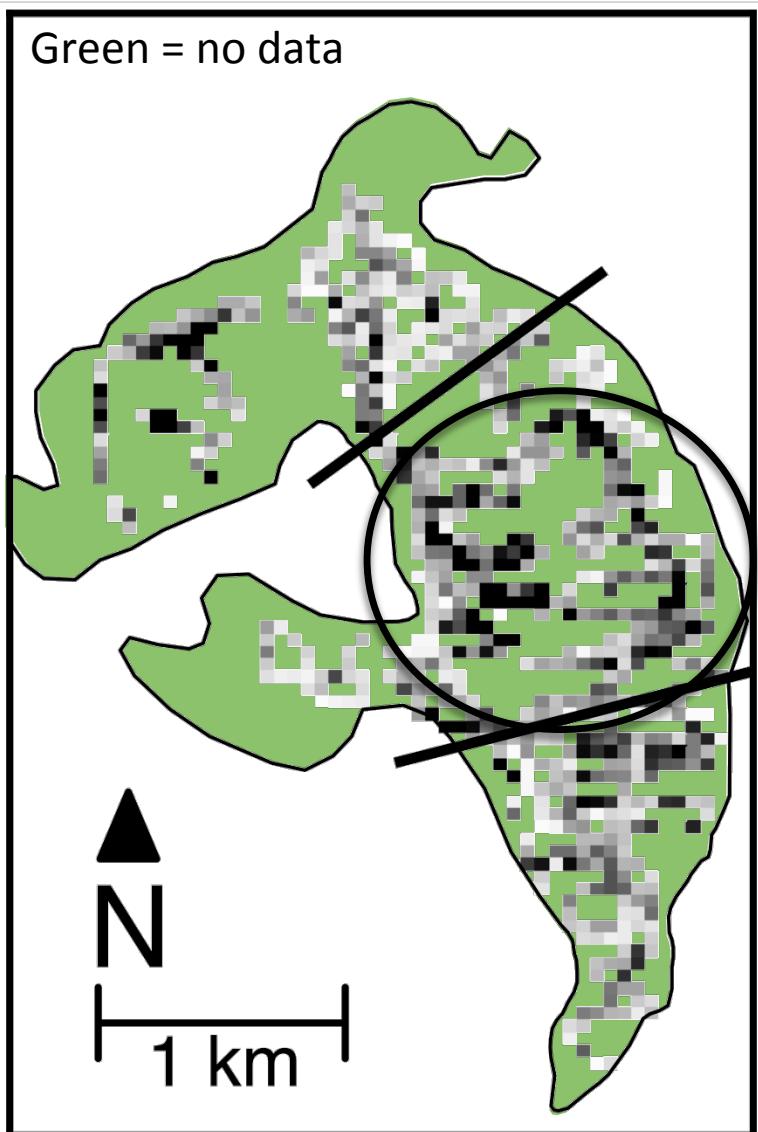
Example: Making use of **geodesic distance** in Gaussian Process model



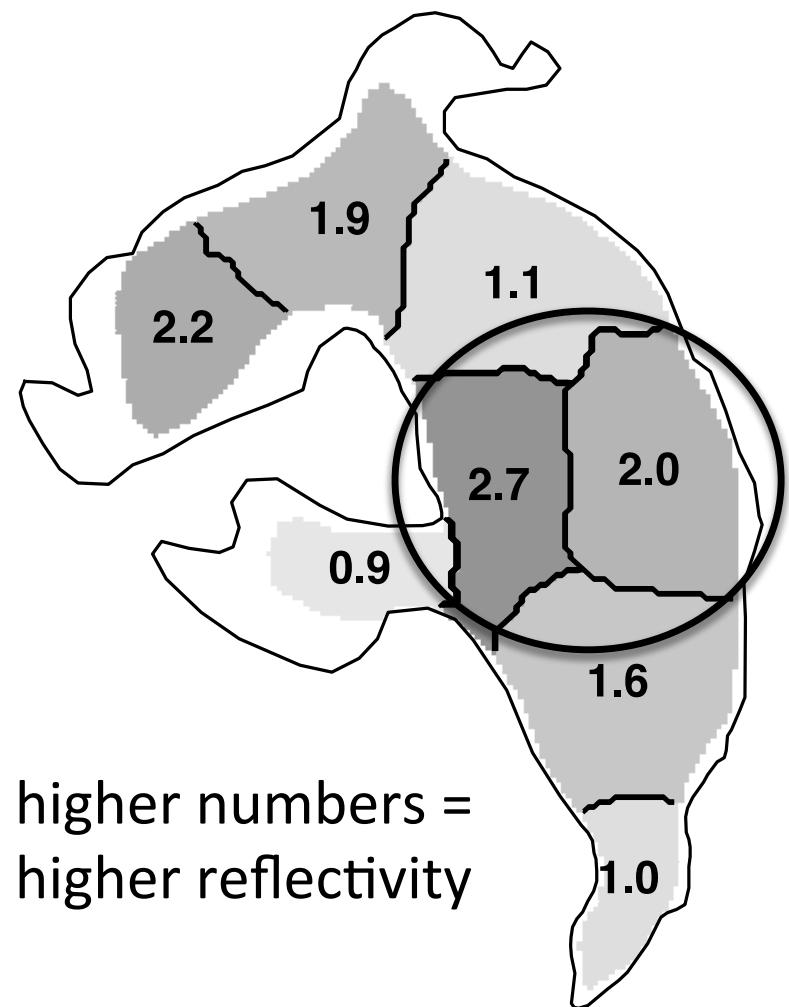
Pratola, M.T., Harari, O., Bingham, D. and Flowers, G.E., 2017. Design and Analysis of Experiments on Nonconvex Regions. *Technometrics*, 59(1), pp.36-47.

Data for model tuning / evaluation

Radar reflectivity of glacier bed



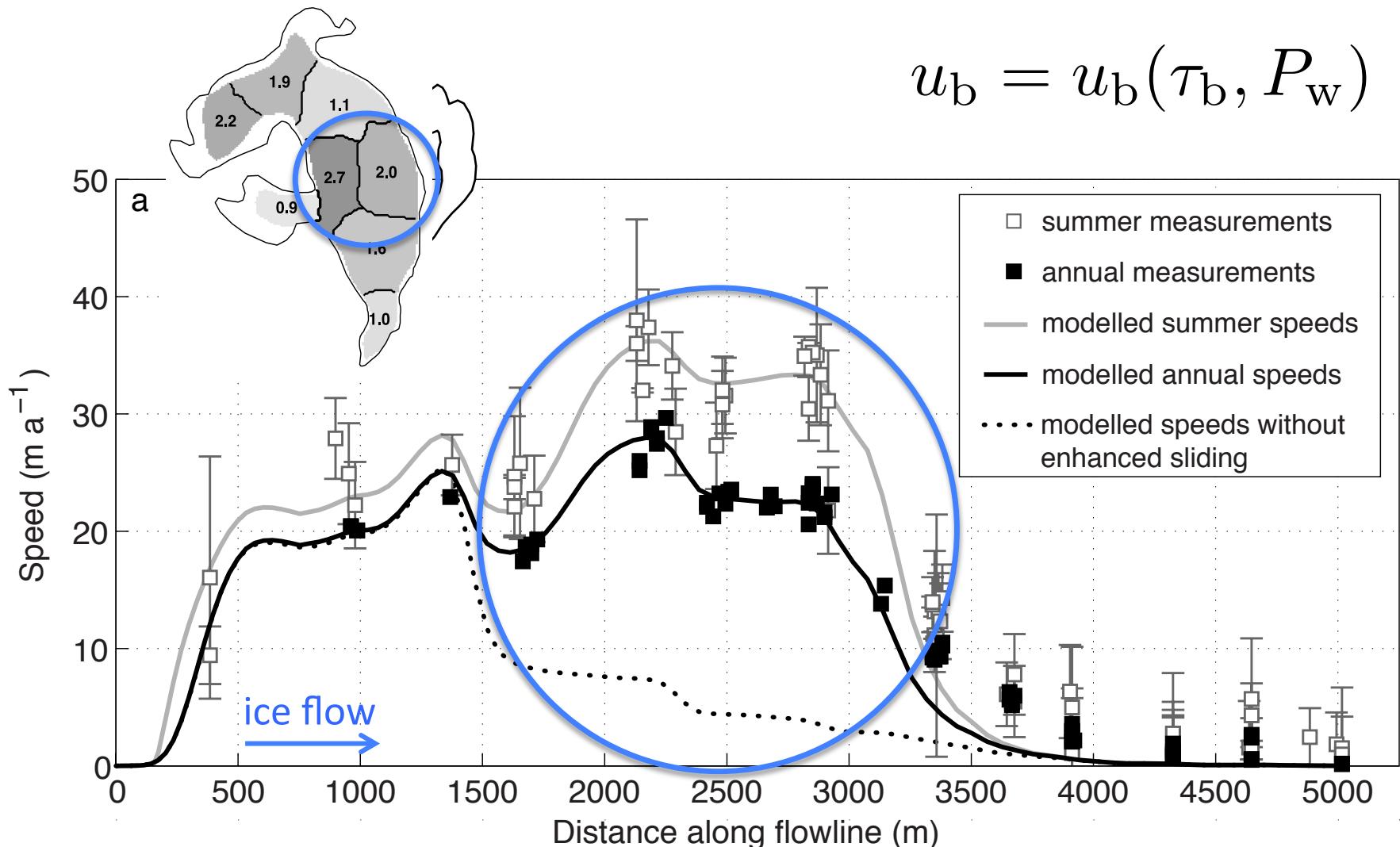
Reflectivity classified using spectral clustering



Wilson, N.J., G.E. Flowers, L. Mingo. 2014. Mapping and interpretation of bed reflection power from a surge-type polythermal glacier. *Annals of Glaciology*, 55(67), 1-8.

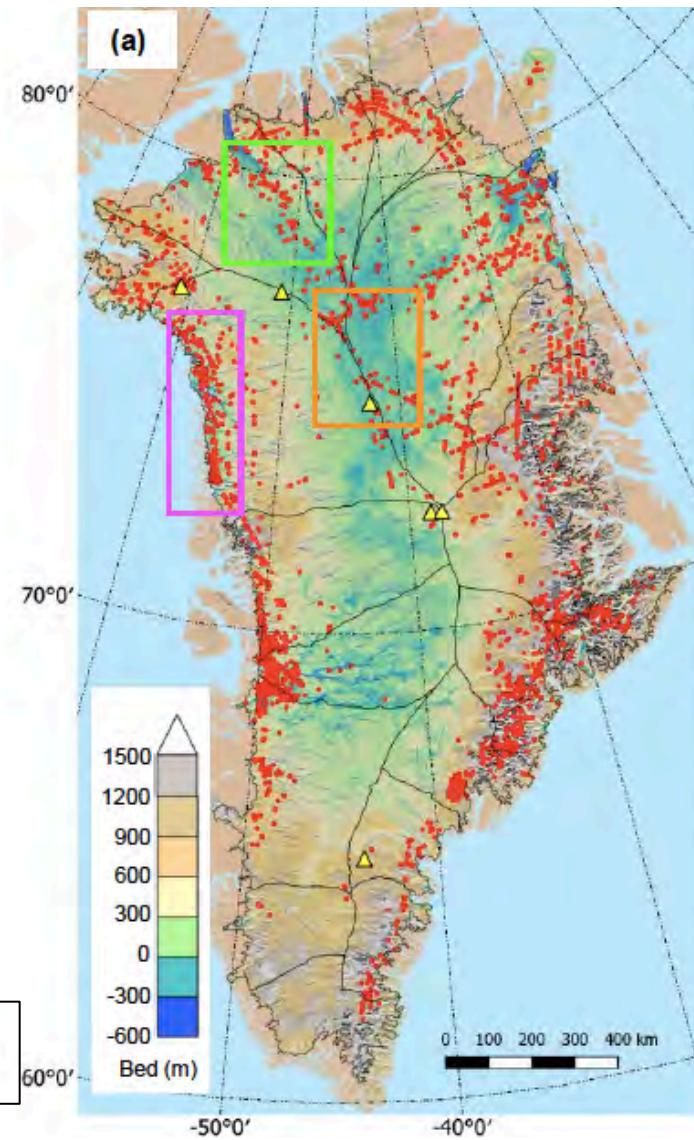
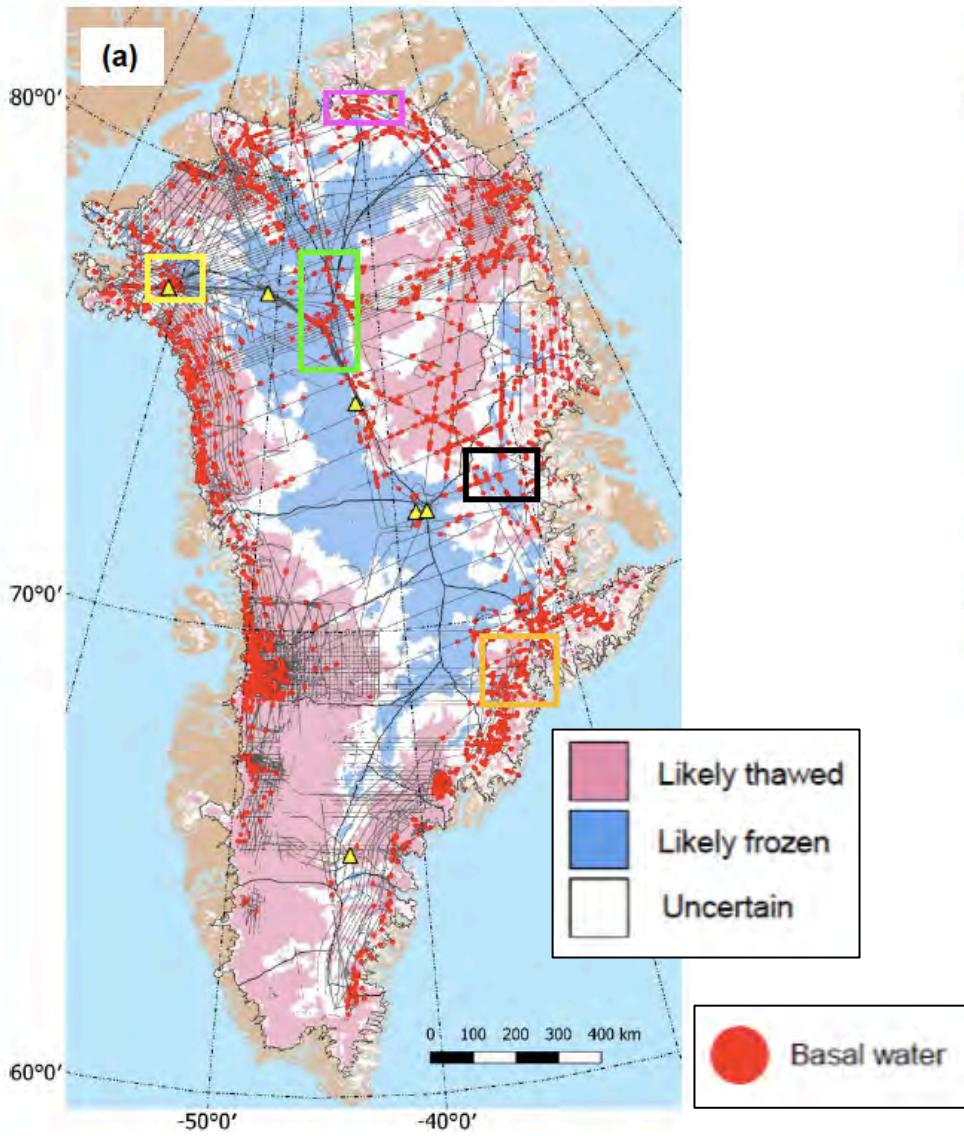
Data for model tuning / evaluation

$$u_b = u_b(\tau_b, P_w)$$



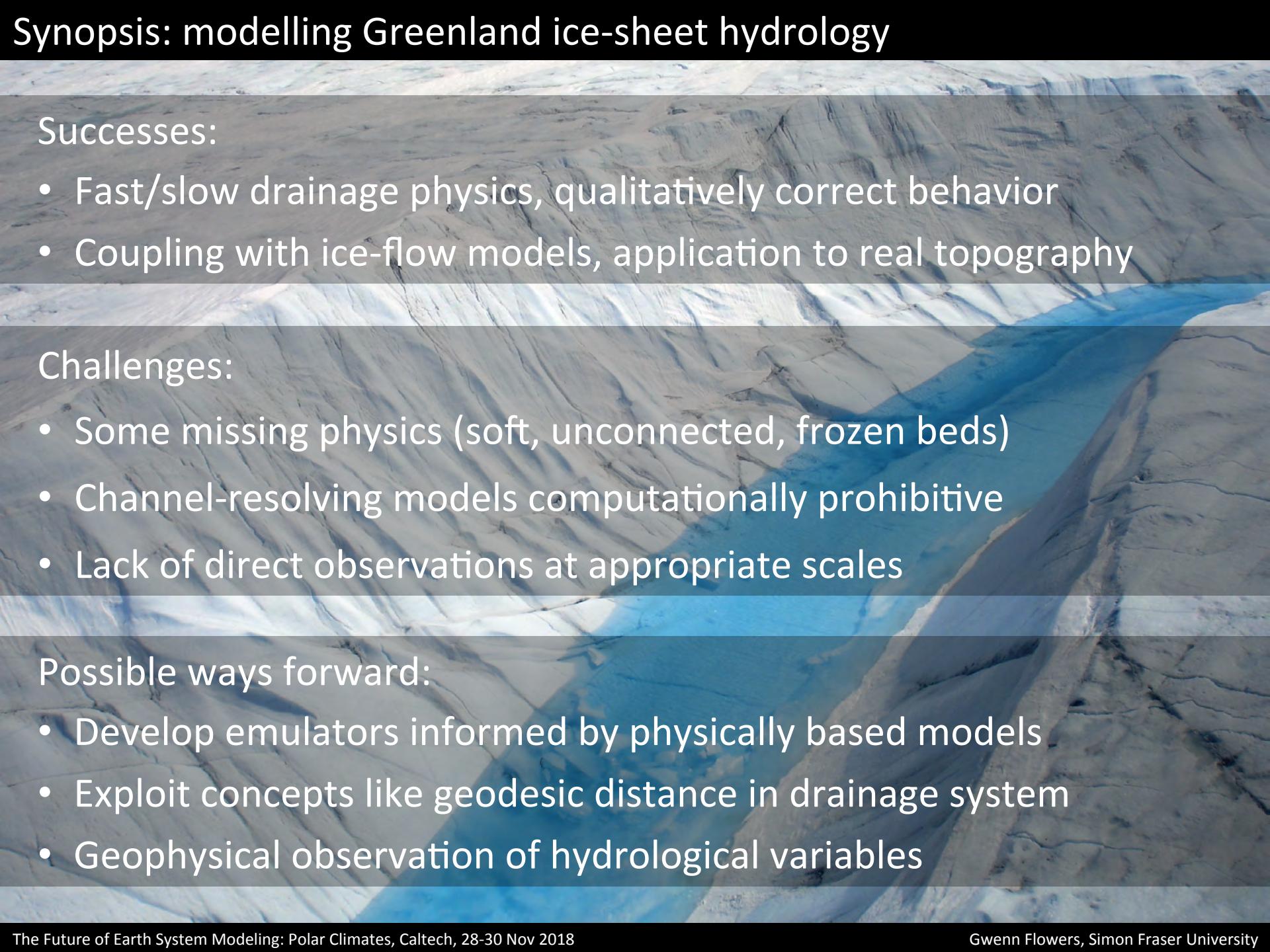
Elevated basal water pressure can explain anomalous flow speeds

Data for model tuning / evaluation



Jordan, T.M., Williams, C.N., Schroeder, D.M., Martos, Y.M., Cooper, M.A., Siegert, M.J., Paden, J.D., Huybrechts, P. and Bamber, J.L., 2018. A constraint upon the basal water distribution and thermal state of the Greenland Ice Sheet from radar bed echoes. *Cryosphere*, 12(9).

Synopsis: modelling Greenland ice-sheet hydrology

A high-angle aerial photograph of a glacier. The surface is covered in white snow and ice, with numerous deep blue meltwater lakes scattered across it. The terrain is rugged and textured, showing the flow patterns of the glacier.

Successes:

- Fast/slow drainage physics, qualitatively correct behavior
- Coupling with ice-flow models, application to real topography

Challenges:

- Some missing physics (soft, unconnected, frozen beds)
- Channel-resolving models computationally prohibitive
- Lack of direct observations at appropriate scales

Possible ways forward:

- Develop emulators informed by physically based models
- Exploit concepts like geodesic distance in drainage system
- Geophysical observation of hydrological variables