## **Multiscale Models of Melting Arctic Sea Ice**

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## Arctic sea ice decline - faster than predicted by climate models

Stroeve et al., GRL, 2007



#### Impact of melt ponds on Arctic sea ice simulations from 1990 to 2007

Flocco, Schroeder, Feltham, Hunke, JGR Oceans 2012

#### For simulations with ponds, the September ice volume is nearly 40% lower.

# sea ice is a multiscale composite

#### structured on many length scales



millimeters



centimeters

pancakes

## melt ponds





ice floes

#### meters

#### kilometers

## thin silver film

## **Arctic melt ponds**

kilometers



(Perovich, 2005)

optical properties

composite geometry -- area fraction of phases, connectedness, necks

microns



(Davis, McKenzie, McPhedran, 1991)

# **HOMOGENIZATION**



inhomogeneous medium homogeneous medium

find the homogeneous medium which behaves macroscopically the same as the inhomogeneous medium

Maxwell 1873 : effective conductivity of a dilute suspension of spheres Einstein 1906 : effective viscosity of a dilute suspension of rigid spheres in a fluid

#### brine volume fraction and *connectivity* increase with temperature



#### $T = -15 \,^{\circ}\text{C}, \ \phi = 0.033$ $T = -6 \,^{\circ}\text{C}, \ \phi = 0.075$ $T = -3 \,^{\circ}\text{C}, \ \phi = 0.143$



 $T=-8^{\,\rm o}\,{\rm C}, \ \ \varphi=0.057$  X-ray tomography for brine in sea ice



 $T = -4^{\circ} C, \phi = 0.113$ 

Golden, Eicken, Heaton, Miner, Pringle and Zhu, GRL, 2007

# percolation theory

## mathematical theory of connectedness

impermeable



permeable



p = 2/3

bond  $\longrightarrow$  open with probability p closed with probability 1-p

> percolation threshold  $p_c = 1/2$  for d = 2

first appearance of infinite cluster

"tipping point" for connectivity

# order parameters in percolation theory

#### geometry

#### correlation length

(characteristic scale of connectedness)

#### transport

effective conductivity or fluid permeability



#### **UNIVERSAL critical exponents for lattices -- depend only on dimension**

(1 ≤ *t* ≤ 2, Golden, *Phys. Rev. Lett.* 1990; *Comm. Math. Phys.* 1992)

#### non-universal behavior in continuum

# Critical behavior of fluid transport in sea ice



critical brine volume fraction  $\phi_c \approx 5\%$   $\checkmark$   $T_c \approx -5^{\circ}C, S \approx 5$  ppt

# **RULE OF FIVES**

Golden, Ackley, Lytle Science 1998 Golden, Eicken, Heaton, Miner, Pringle, Zhu Geophys. Res. Lett. 2007 Pringle, Miner, Eicken, Golden J. Geophys. Res. 2009

## rule of fives constrains key processes in sea ice physics and biology

#### evolution of Arctic melt ponds and sea ice albedo



#### nutrient flux for algal communities





- drainage of brine and melt water
- ocean-ice-air exchanges of heat, CO<sub>2</sub>
- Antarctic surface flooding and snow-ice formation
- evolution of salinity profiles

# linkage of scales



Thermal evolution of permeability and microstructure in sea ice Golden, Eicken, Heaton, Miner, Pringle, Zhu



rigorous bounds percolation theory hierarchical model network model

#### field data

X-ray tomography for brine inclusions

unprecedented look at thermal evolution of brine phase and its connectivity

controls

micro-scale

macro-scale processes

## melt pond formation and albedo evolution:

- major drivers in polar climate
- key challenge for global climate models

numerical models of melt pond evolution, including topography, drainage (permeability), etc.

Lüthje, Feltham, Taylor, Worster 2006 Flocco, Feltham 2007 Skyllingstad, Paulson, Perovich 2009 Flocco, Feltham, Hunke 2012



Are there universal features of the evolution similar to phase transitions in statistical physics?

#### fractal curves in the plane

they wiggle so much that their dimension is >1



## clouds exhibit fractal behavior from 1 to 1000 km



use *perimeter-area* data to find that cloud and rain boundaries are fractals

 $D \approx 1.35$ 

S. Lovejoy, Science, 1982

 $P \sim \sqrt{A}$ 

simple shapes

 $A = L^2$  $P = 4L = 4\sqrt{A}$ 

 $P \sim \sqrt{A}^{D}$ 



L

for fractals with dimension D

#### Transition in the fractal geometry of Arctic melt ponds

The Cryosphere, 2012

Christel Hohenegger, Bacim Alali, Kyle Steffen, Don Perovich, Ken Golden



## transition in the fractal dimension

complexity grows with length scale



compute "derivative" of area - perimeter data

#### small simple ponds coalesce to form large connected structures with complex boundaries



## melt pond percolation

## map melt pond configurations onto resistor networks compute horizontal fluid permeability



#### 4 August 2005, Healy–Oden Trans Arctic Expedition (HOTRAX)

Network modeling of Arctic melt ponds Barjatia, Tasdizen, Song, Golden 2014

SCI and Math, U. of Utah

## **Continuum percolation model for melt pond evolution**

Brady Bowen, Court Strong, Ken Golden, 2014



random Fourier series representation of surface topography



#### intersections of a plane with the surface define melt ponds







electronic transport in disordered media

diffusion in turbulent plasmas

(Isichenko, Rev. Mod. Phys., 1992)

# Coefficients of Fourier surface chosen to produce topography with given autocorrelation and anisotropy



# Fractal properties of simulated ponds



Example for surface autocorrelation 0.5 anisotropy 1.4

## **Comparison with PDE Model**

 Physically-based partial differential equation (PDE) melt pond model that includes seepage, pond-enhanced albedo, and horizontal transport (Lüthje et al. 2006).



Lüthje, M., D. L. Feltham, P. D. Taylor, and M. G. Worster (2006), Modeling the summertime evolution of seaice melt ponds, J. Geophys. Res., 111, C02001, doi:10.1029/2004JC002818.

#### simple stochastic growth model of melt pond evolution



Rebecca Nickerson (West HS, Salt Lake City) and Ken Golden

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"melt ponds" are clusters of magnetic spins that align with the applied field

**Ma, Sudakov, Golden 2014** (Thekkedath, Alali, Strong, Golden)

# **Melt Pond Ising Model**

- Minimize an Ising Hamiltonian random magnetic field represents the initial ice topography interaction term represents horizontal heat transfer
- Ice-albedo feedback incorporated by taking coupling constant in interaction term to be proportional to the pond coverage





predicted length scale of fractal transition agrees well with data



random matrix characterization of connectedness transition -- discretization of  $\chi\Gamma\chi$ 

Unfolded Eigenvalue Spacing Distribution

#### **ARCTIC MELT PONDS**



eigenvalue statistics for transport tend toward the UNIVERSAL Wigner-Dyson distribution as the "conducting" phase becomes connected over large scales

uncorrelated — *"level repulsion"* 

N. B. Murphy, K. M. Golden 2014

# a few results related to melt pond evolution

## higher threshold for fluid flow in Antarctic granular sea ice

#### columnar

**5%** 

granular



10%

Golden, Gully, Sampson, Lubbers, Tison 2014

## SIPEX II vertical permeability data



#### forward and inverse bounds on the complex permittivity of sea ice

inversion for brine inclusion separations in sea ice from measurements of effective complex permittivity  $\epsilon^*$ 

Orum, Cherkaev, Golden Proc. Roy. Soc. A, 2012



polycrystalline bounds two-scale homogenization Gully, Lin, Cherkaev, Golden, 2014 electromagnetically distinguish between granular and columnar sea ice

#### Arctic melt ponds and bifurcations in the climate system

I. Sudakov, S. A. Vakulenko, and K. M. Golden

Communications in Nonlinear Science and Numerical Simulation, in press, 2014.

investigate effect of fractal transition in melt pond geometry on conceptual climate models, bifurcations, multiple equilibria, etc.

#### The Conundrum of Melt Pond Formation:

#### How can ponds form on top of sea ice that is highly permeable?

C. Polashenski, K. M. Golden, E. Skyllingstad, D. K. Perovich

# 2014 Study of Under Ice Blooms in the Chuckchi Ecosystem (SUBICE) aboard USCGC Healy



# Hypothesis – Freshwater re-seals ice Borehole test with varying salinity





#### Figure 3a - Hydraulic Head vs. Time, Freshwater Percolation Seals Ice

Dyed tracer confirms that ice was permeable and blockage occurs within the ice matrix





# **Summary**

1. Summer Arctic sea ice is melting rapidly, and understanding melt pond evolution is critical to improving projections.

2. Melt ponds exhibit a fundamental transition in fractal geometry around a critical length scale.

3. Mathematical models of composite materials and statistical physics help unravel the complexities of sea ice structure and processes, and provide a path toward rigorous representation of sea ice in climate models.

# **THANK YOU**

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Buchanan Bay, Antarctica Mertz Glacier Polynya Experiment July 1999