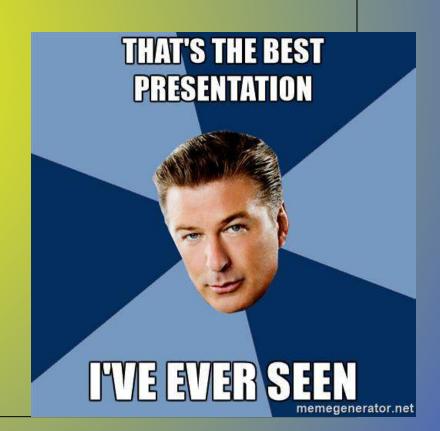
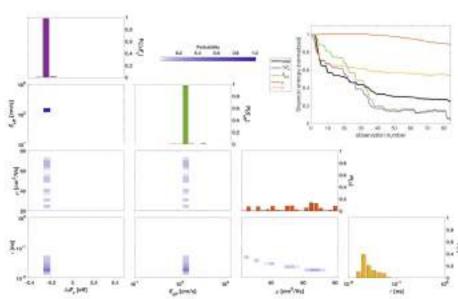
# User Support Services shelley.knuth@colorado.edu Shelley Knuth Research Computing, University of Colorado-Boulder

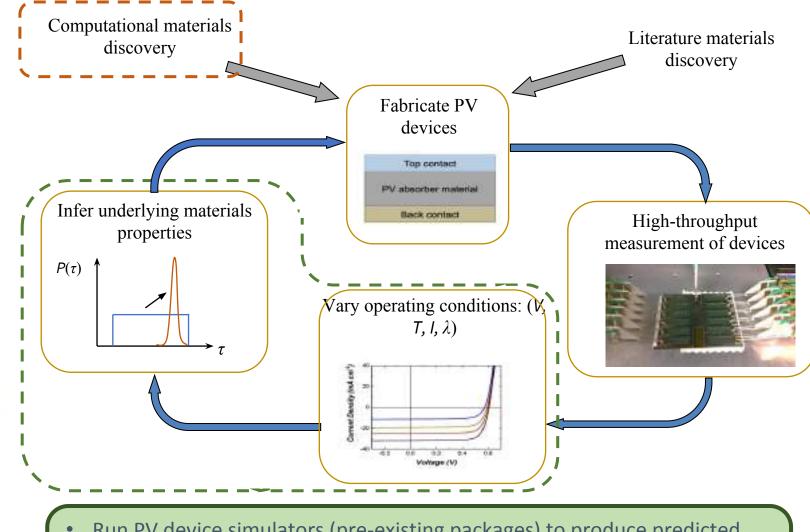
- Infrastructure is only as good as how well the users understand how to use
  it
- Manage and provide many services
  - Trainings
    - "Basics of Supercomputing" Bootcamp
    - "New User Seminar"
    - "Parallelization in Scripted Languages"
    - Software Carpentry
    - Python Short Course
    - Bokeh
  - Consulting
    - Student cohort
    - Office hours data, HPC
    - Help desk
    - Online documentation
    - Videos



## Rachel Kurchin: Discovery of Next-Generation Photovoltaic Materials

- Density functional theory (VASP)
- Seeking to understand the physics of point defects (structure, energetics, etc.) in order to design materials less susceptible to their ill effects on device performance





- Run PV device simulators (pre-existing packages) to produce predicted current-voltage sweeps at a variety of values for input parameters
- Use Bayesian parameter estimation to find best values for those parameters

#### Yuanxun Bao, Courant Institute, NYU

▶ Fast algorithms for fluid-structure and fluid-particle interactions.



Figure: A suspension of colloidal boomerangs (B. Sprinkle et al.)

- $\triangleright$  **Q** = { $\mathbf{q}_{\beta}, \boldsymbol{\theta}_{\beta}$ } $_{\beta=1}^{N}$ : positions and orientations
- > The Ito stochastic equation of **Brownian Dynamics** (BD) is

$$\frac{d\mathbf{Q}}{dt} = \mathbf{NF} + (2k_B T \mathcal{N})^{\frac{1}{2}} \mathcal{W}(t) + (k_B T) \partial_{\mathbf{Q}} \cdot \mathcal{N}$$

Hydrodynamic interations, Brownian displacements, stochastic drift.

- $\triangleright$   $\mathcal{N}(\mathbf{Q})$  is a  $6N \times 6N$  dense matrix.
- ho  $\mathcal{N}^{rac{1}{2}}$  is a matrix "square root", defined by  $\mathcal{N}^{rac{1}{2}}\left(\mathcal{N}^{rac{1}{2}}
  ight)^{ op}=\mathcal{N}.$
- ho Goal: to develop methods that can scale for  $N\sim O(10^4)-O(10^5)$ .

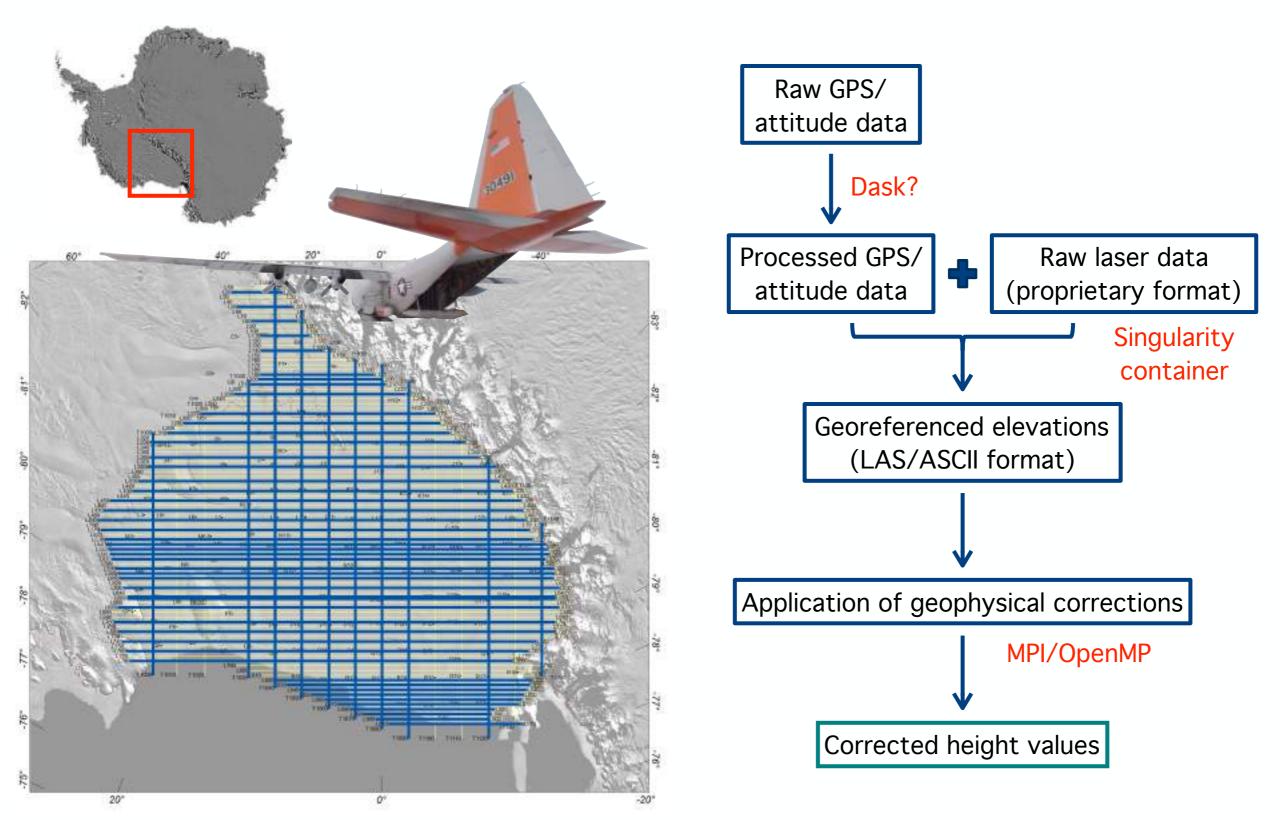
#### Yuanxun Bao, Courant Institute, NYU

$$rac{d\mathbf{Q}}{dt} = \underbrace{\mathcal{N}\mathbf{F}}_{\mathcal{O}(\mathcal{N}^2)} + \sqrt{2k_BT} \underbrace{\mathcal{N}^{rac{1}{2}}}_{\mathcal{O}(\mathcal{N}^3)} \mathcal{W}(t) + (k_BT) \partial_{\mathbf{Q}} \cdot \mathcal{N}$$

- Naively, computing the right-hand-side is  $O(N^3)$  for every time step (even if you knew  $\mathcal{N}$  already)!
- Demands both fast algorithm and parallel implementation.
- > We now have a fast method that scales O(N) and a serial implementation.
- → Heavily builds on top of fast linear solvers (GMRES, Lanczos, FFT).
- ▷ Things to try: Python/Cython, Numba, PyCUDA/CUDA.
- ▷ Code optimization and performance analysis.

# Mapping Ross Ice Shelf with Airborne Laser Altimetry

Maya Becker, Scripps Institution of Oceanography, UC San Diego Advisor: Dr. Helen Amanda Fricker



#### Tracking oceanic eddies

Suyash Bire, Christopher Wolfe

August 4, 2017

#### **Eddy Tracking**

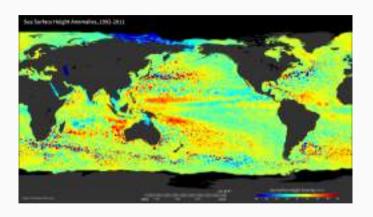
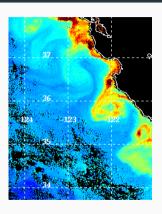


Figure 1: Eddies in the ocean

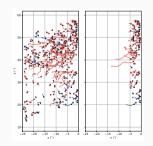


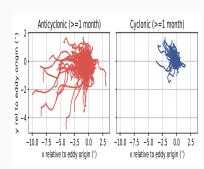
**Figure 2:** California Current eddies

Animation!

#### Properties of individual eddies

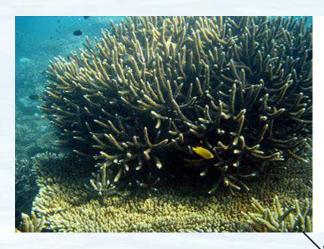
|     |           | nat .          | Microsi       | iteer .     | berren.     | 1   | N         | bear     |            | inte      | 100      | 1      | wit   |
|-----|-----------|----------------|---------------|-------------|-------------|-----|-----------|----------|------------|-----------|----------|--------|-------|
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Tracking code makes use of python's multiprocessing module! https://github.com/suyashbire1/eddy\_tracking

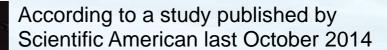
# Problem:Coral Reef Bleaching





 Under natural and anthropogenic stress the zooxanthellae algae leaves the coral

 The coral is likely to die after several weeks



"If tropical reefs and other ecosystems are destroyed, the oceans could lose \$1 trillion in economic value "by the end of the century,"

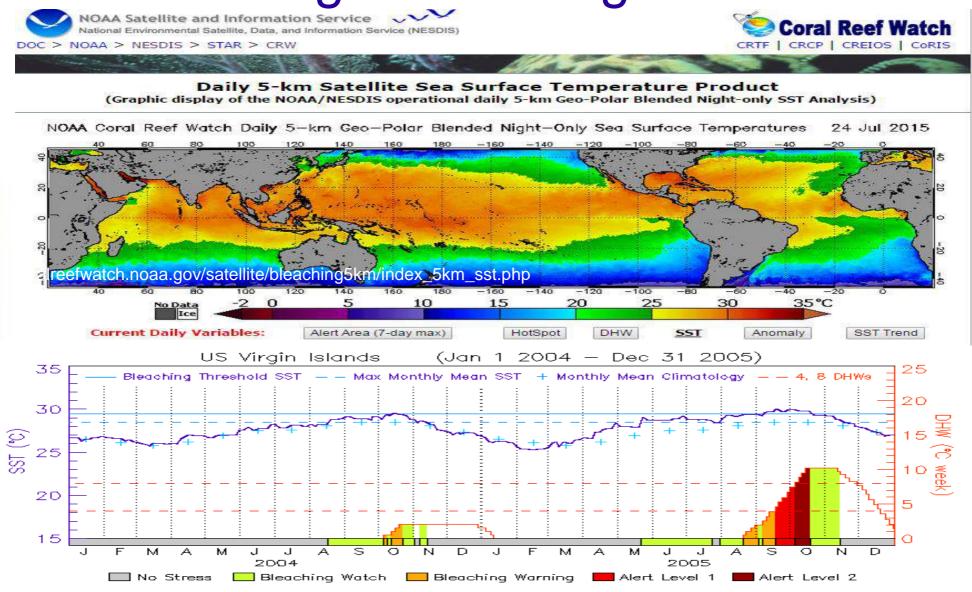
#### Sources:

# NOAA's Integrated Ocean Observing System



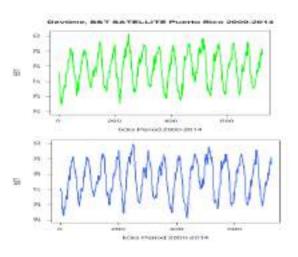
Satellites, radars, weather stations, weather balloons, sounders, buoys, along with expertise and the data management infrastructure needed for monitoring and analyzing the system=> BIG DATA SETS

# Background:Sea Surface Temperature and Degree Heating Week

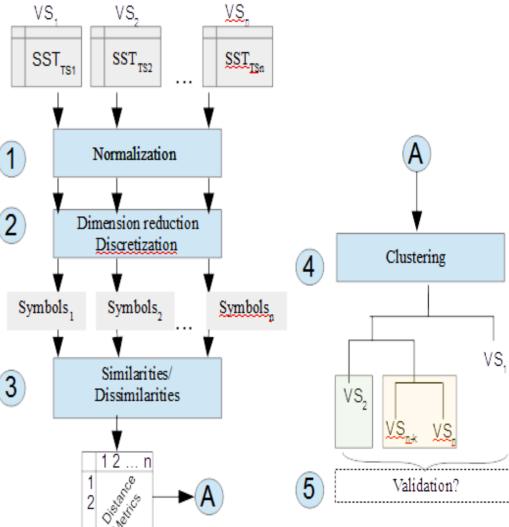


http://coralreefwatch.noaa.gov/satellite/bleaching5km/index\_5km\_baa\_max\_r07d.php

# **Overall Method**



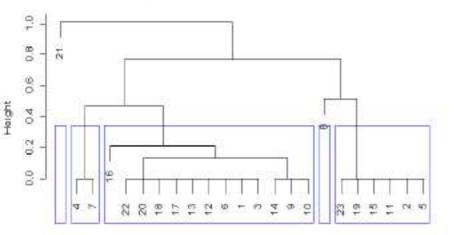




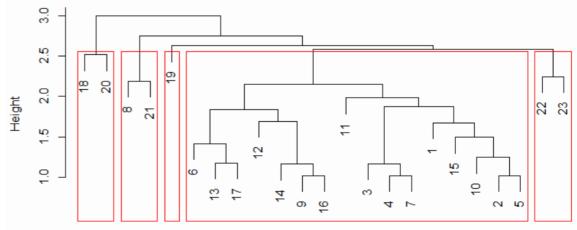
# Sea Surface Temperatures vs. Degree Heating Week



STT SAX -Hierarchical Clustering - 23 Virtual Stations Caribbean



#### DHW SAX -Hierarchical Clustering - 23 Virtual Stations Caribbean



dodrnsymbsst hckst (\*, "average")

dcdmsymbdhw hclust (\*, "average")

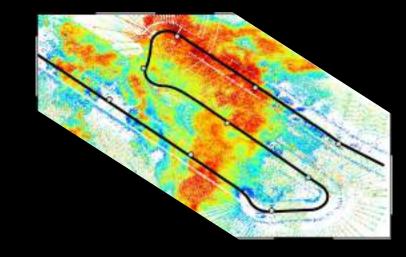
# Radar Validation of Weather Forecasts in California

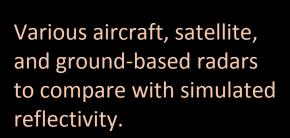
Forest Cannon

Center for Western Weather and Water Extremes Scripps Institution of Oceanography, UCSD

- Weather forecasts are an original HPC problem
- Additional need for NRT assimilation of observations & rapidly verified forecasts
- Complex geometry problem with multiple dependencies
- Well-suited for workflow organization

Could benefit from improved VISIT







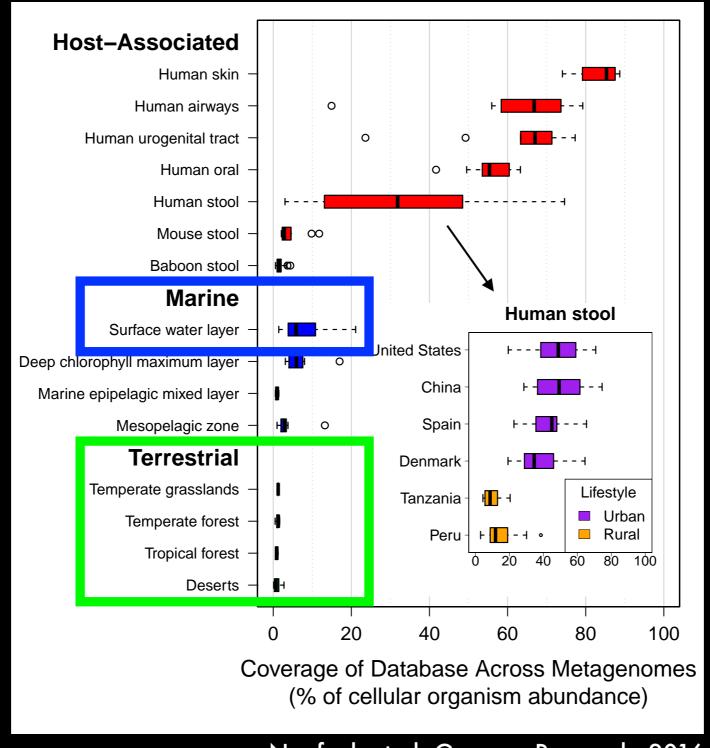
# microbial ecology

Alexander B. Chase UC Irvine Dr. Jennifer Martiny

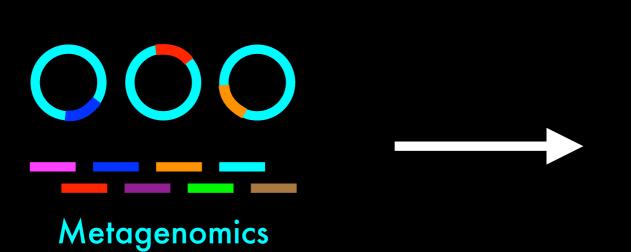
# **Environment** Bacteria Genomic DNA Targeted **Random Target** 16S rRNA Metagenomics 100M reads/sample

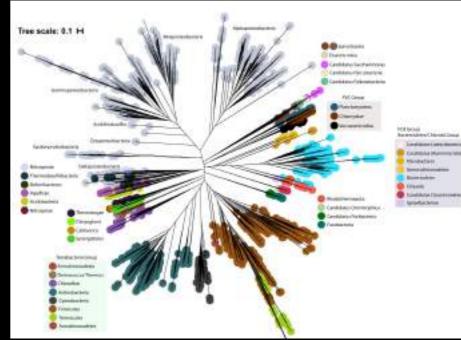
Microbial "Species" - ???; can be defined at <u>OTU</u> level, >90% AAI or >95% ANI at whole genome level

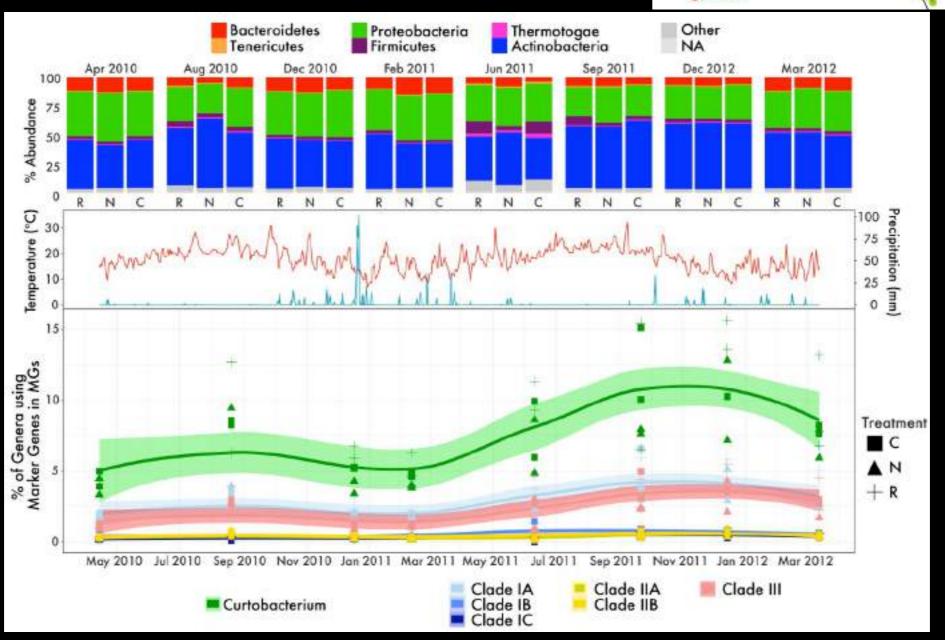
Microdiversity - closely-related (>97% similar 16S rRNA; same <u>OTU</u>) with distinct sub-taxonomic groups



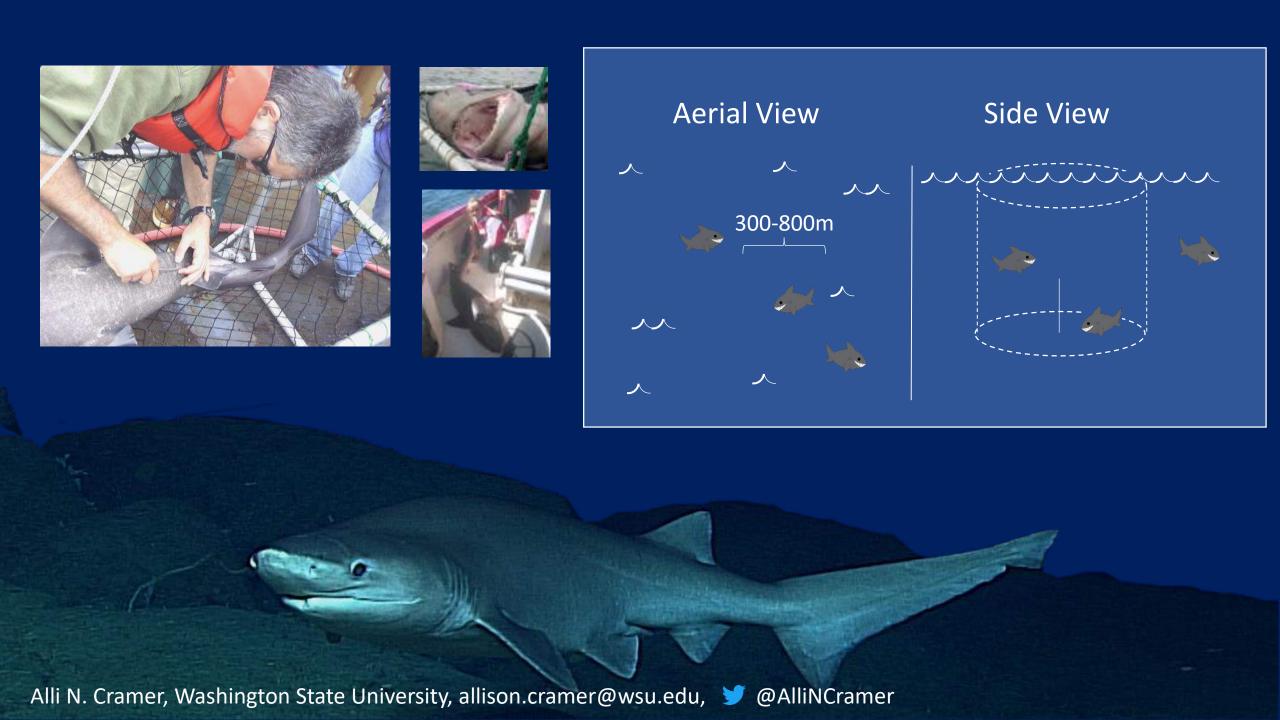
Nayfach et al. Genome Research. 2016

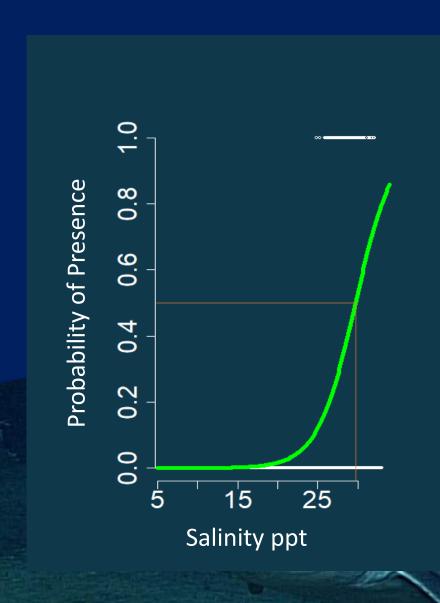


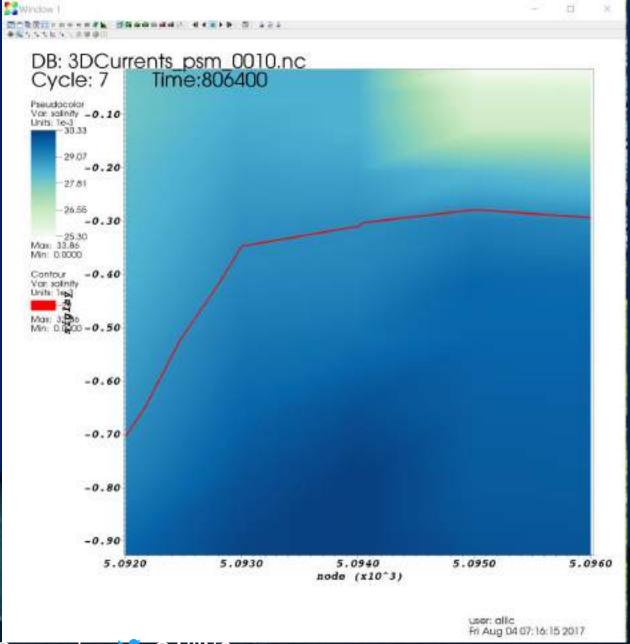




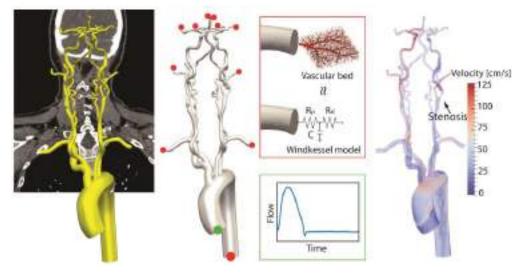
Chase et al. mBio. submitted







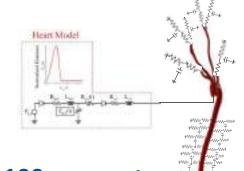
#### Image based blood flow simulation



# Animal Models Hypertension Experimental Methods Computational Methods

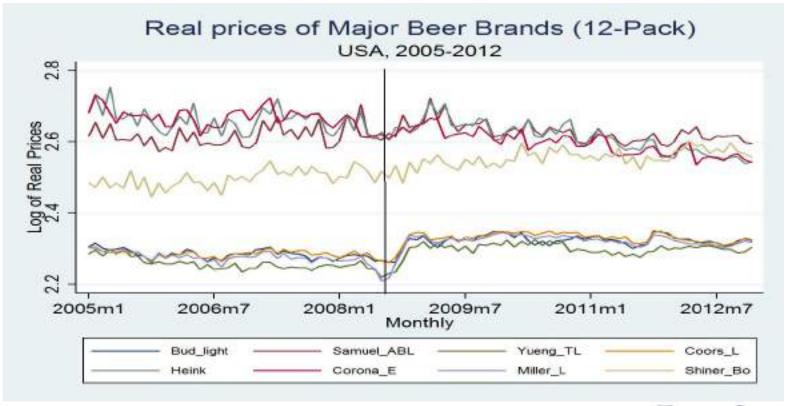
#### **Applications**:

- Disease research
- Medical device design and evaluation
- Surgical planning



- Estimate 100 parameters each simulation
- Time consuming
- Non systematic task

# Does a recent merger leads to collusive behavior in the US beer market?





# Approach......HPC!!!

- Date sets: Retail scanner, Demographic, brand features data
- Estimation of (RCLM) demand/Supply models to find the best fit.
- Optimization techniques require solving hessian matrix (numerically) –
- Result Reject collusive behavior support brewers take all and control prices
- Way forward Nielson Data set



# My research: Biology - related

## Type of computing:

- Thousands of gigabytes of sequencing/text files downloaded from databases
- Lots of intermediate steps
- Mostly parallel until later stages
- Associations studies (logistic regression)
- Image classification

### Huan Fan



## What I've learnt

- San Diego is a very nice place
- Sea lions are more common than seals
- Singularity
- Performance of code and optimization
- Python3
  - Compiler: numba
  - Outofcore problem: dask, joblib, concurrant.future
  - Spark: big record data
  - Never leave your jupyter notebook
- Image classification: scikit-learn + deep learning







# Social Networks and Social Influence





















# Social Influence in organizations

# Why the need for supercomputing?

- Social influence algorithms have high complexity but can run in parallel
- Availability of large scale data of social connectivity
- Analysis of Social Influence over time requires dealing with even larger datasets

#### References:

Albert, Réka, and Albert-László Barabási. "Statistical mechanics of complex networks." *Reviews of modern physics* 74.1 (2002): 47. Newman, M. E. (2001). The structure of scientific collaboration networks. *Proceedings of the National Academy of Sciences*, *98*(2), 404-409. Newman, Mark EJ, and Juyong Park. "Why social networks are different from other types of networks." *Physical Review E* 68.3 (2003): 036122. Wasserman, Stanley, and Katherine Faust. *Social network analysis: Methods and applications*. Vol. 8. Cambridge university press, 1994.



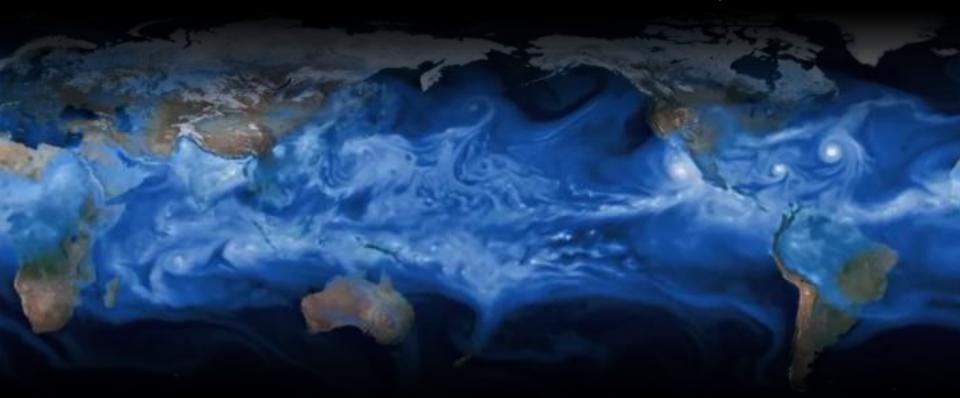
# Benjamin Fildier

Full movie at https://www.youtube.com/watch?v=cNyftYdjt-Q

**Credentials:** Michael Wehner, LBNL

Resolution: 25km

Atmospheric content of "rainable" water



(Very) crude representation of rain and clouds in climate models

- Main source of uncertainty in climates projections
- Collateral damages on the energy balance, temperature changes, etc.
- Misunderstood dynamics and future impacts of heavy rainfall events

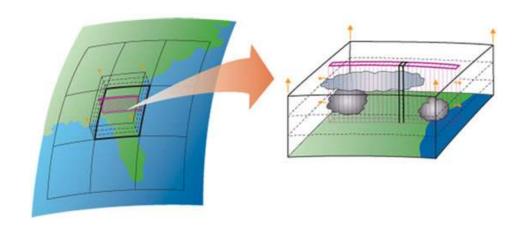
## Latest project: rainfall extremes in a multiscale modeling framework

**Simulations** 

(needed some notions of OpenMP&MPI and optimization)

Analysis

(will definitely use VisIt, Python-dask or Spark, and workflows)



Each 3D variable on smaller grid at each time slice is  $\approx 10MB$ .

To study the dynamics of extremes, I have to constantly operate on hourly-averaged outputs. Full dataset is currently **2TB** (1-year runs only).

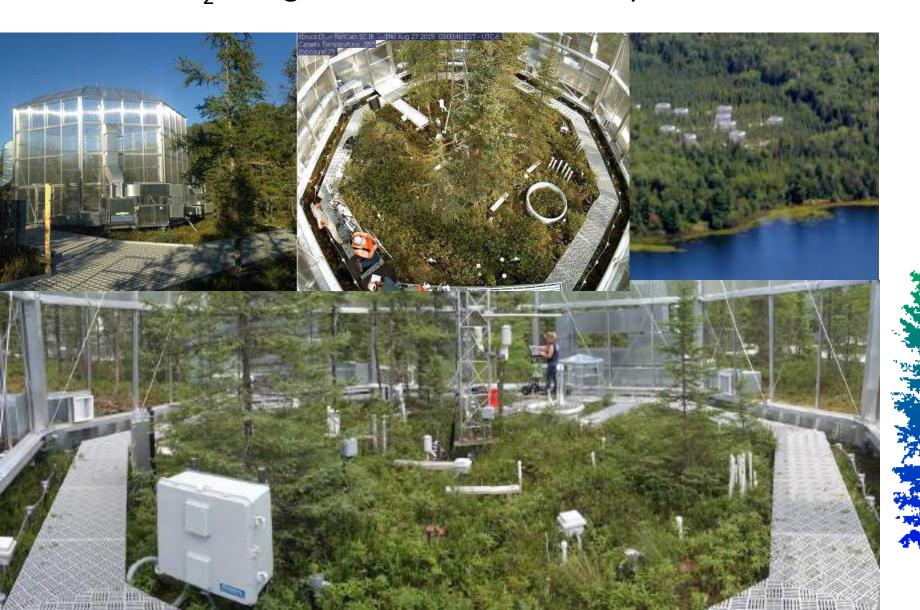
# of CPU\*hours/simulated\_year is  $O(10^4)$ (for Haswell nodes on Cori with 32 cores/node) For 100 cores  $\approx 4$  days/simulated\_year

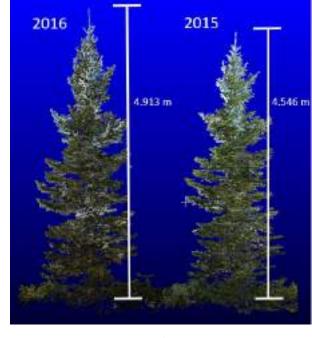
Now I want to upscale...
(finer time/space resolutions and longer runs)

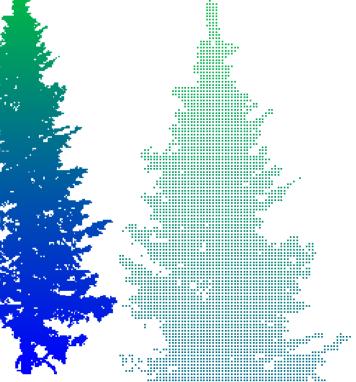
O(100TB)-O(1PB)?

# TLS at SPRUCE

• Elevated CO<sub>2</sub> and gradient of elevated temperatures in chambers

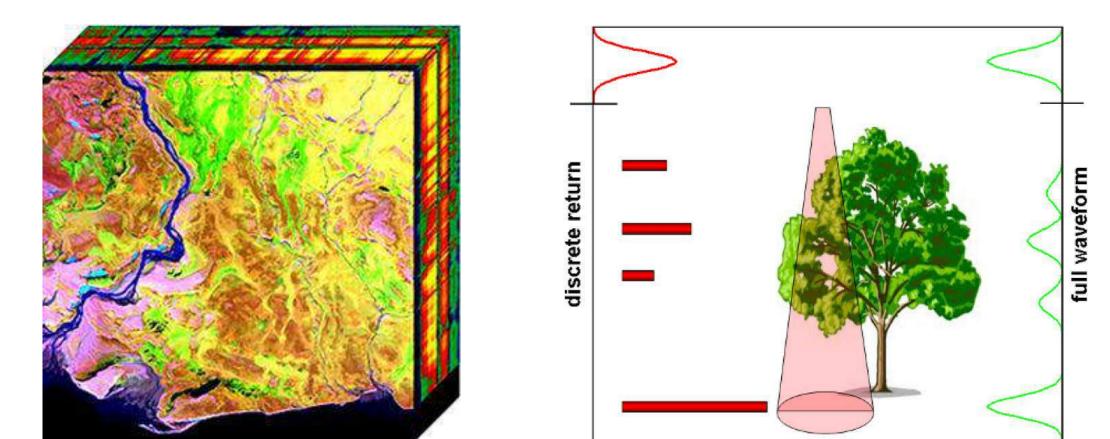






# Data Integration & Processing

- Ex. Reynolds Creek Experimental Watershed
- Hyperspectral imagery & full waveform lidar
- Terabytes of data to process



## Full-3D Tomography of Central Mexico

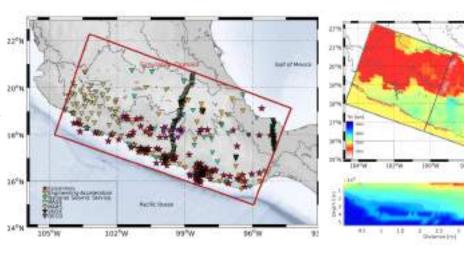
Alan Juarez\*, Thomas Jordan\*, and Leonardo Ramírez-Guzmán+

+National Autonomous University of Mexico, Mexico City.

#### Database:

- 100 (4.5< $M_w<$ 5.5) earthquakes from 2005-2015
- 65 Green Functions Sources = 165 Sources
- 262 three-component velocity and acceleration stations (> 16,000 seismograms)

Simulations in Octree-based 3D Finite Element Method using the Hercules toolchain (Tu *et al.*, 2006) for elastic wave propagation modeling.

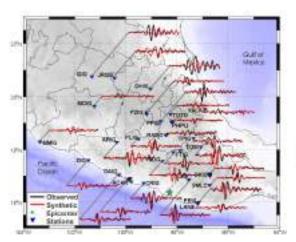


Database: Stations and epicenters.

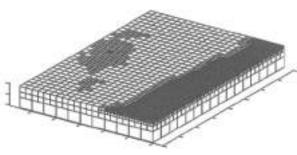
Vs velocity model.

#### Computing (1 iteration):

- 330 simulations
- 0.25 Hz of resolution, 10 ppw
- 1000x500x75 km domain
- 36,441,778 elements/grid
- 84,480 pe units (CPU x hr)
- 90,338 x 9 nodes stored (deformations)
- 300s of simulations, 0.25 s sampling
- 3.8Tb of memory



08/13/2014 - 06:47:30, Oaxaca, Mexico. Mw 4.8, Lon -98.2 Lat 16.4 Depth 7



Octree mesh of central Mexico.

Data processing and optimization problem.

<sup>\*</sup>University of Southern California, Los Angeles CA.

## Faycal Kessouri, PhD

Field:

Project:

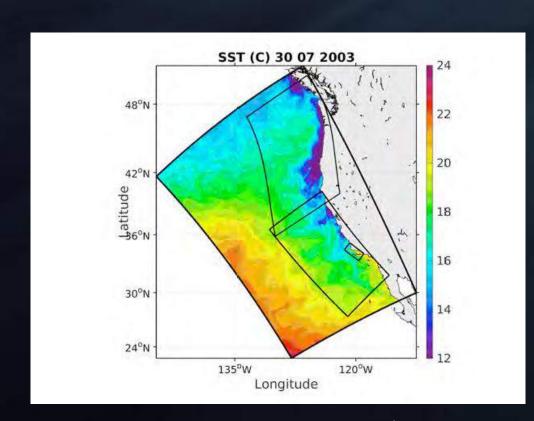
Affiliation (postdoc):

Ocean Modeling - Physics & Biogeochemistry

Modeling the Ocean US West Coast (Pacific Side) Acidification and Hypoxia

University of California Los Angeles (LA)

Southern California Coast Water Research Project (Costa Mesa)



My simulations on Comet: > 30 000 SUs / year Grid: 3D irregular sigma grid: 770 x 1440 x 60 cells

Frequency outputs: Daily

Objectives:

#### Management:

- Anthropogenic effect on acidification and hypoxia along the US Pacific coast
- Helping managers on getting decisions on the inputs

#### Science:

- From the grid downscaling: Sub mesoscale impact on ecological behavior of the plankton
- Ocean current-wind parametrization improves the representation of primary production and offshore matter transport

#### Methods:

ocean physical biogeochemical coupling modeling: Downscaling, refinement and improvement of the model

## **SDSC: SI2017**

Output joining + other operations ...

Makefile → Workflow manager

Inputs (organization: open boundaries and atmospheric forcing, preparation of the parallel sub-domains)

Parallel jobs

Machine learning class

### Posttreatment of the outputs:

- organization, preparation of the outputs for analysis
- Validation of the model (using cruise data, moorings, satellite...)

GitHub workflows & Visualization & Globus transfer classes

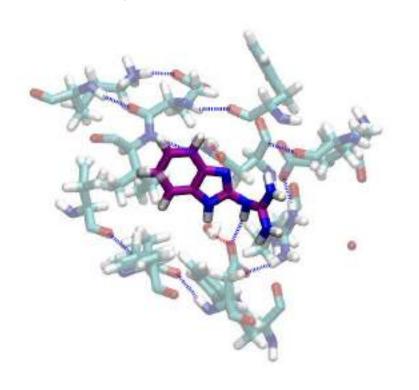
Transfer and sharing model outputs

Science applications (model analysis, visualization, statistics...)

Sharing scripts

Sharing visual outputs (movies, graphics)

# The Hv1 proton channel has therapeutic potential



- There is much to discover on Hv1:
  - What is its structure?
  - o How does it work?
  - Can we inhibit it selectively?
- Applying ideas from SDSC SI 2017

   developing a workflow using
   Kepler for conducting alchemical
   free energy perturbation
   calculations

## Predicting glass transition temperature from small-time simulation.

Zijun Lu

Department of Physics

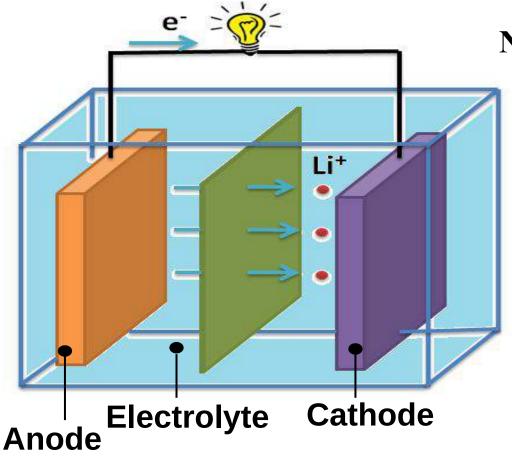
04/08/2017

#### How I benefit from this workshop

- 1. Machine learning with Spark.
   Speed up the data analysis with Spark.
- 2. GPU use in both data analysis and simulation stage. Speed up my simulation and data analysis with GPU use.

## University of Wisconsin Eau Claire





New material & new chemistry

$$Fe^{2+}F_2 + Li^+ \rightarrow LiF + Fe^0$$

Structure



Charges



Atomic interactions



New structure

Computationall

У

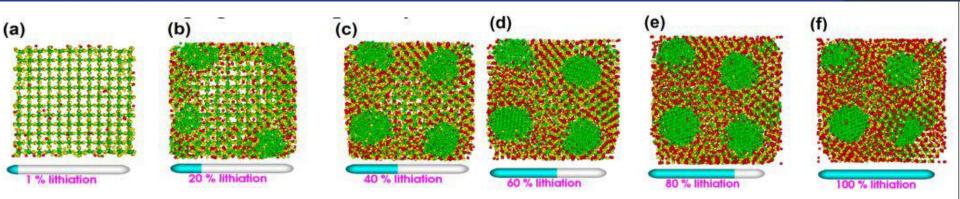
very expensive

Energy density is limited by the cathode material



## University of Wisconsin Eau Claire





Performance profiling & optimization
Introducing OpenMP/OpenACC

GitHub version control

Maybe CUDA

MSE 451 Computational Materials Science (4 crs)

Prerequisite: MSE 350 or PHYS 333 or CHEM 434.

Theory and application of computational methods to model, understand and predict the behavior of materials. Labs provide hands-on experience in solving real materials problems using computational approaches.



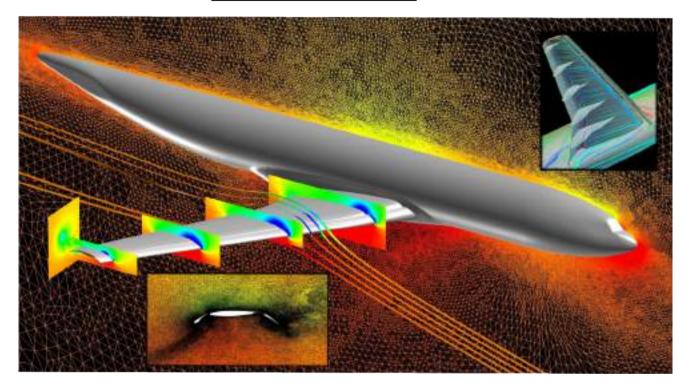
Thank you SDSC!

SI 2017 2



## **CFD Laboratory**

#### **NASA Vision 2030**



Large eddy simulation of aircraft envelope (billions of years using current methods)

"Turbulence is the most important unsolved problem in classical physics"

Richard Feynman

#### **EVIL!** (Needs modeling of higher spatial frequencies)

$$\frac{\partial \mathbf{u}}{\partial t} - \nu \Delta \mathbf{u} + (\mathbf{u} \cdot \nabla) \mathbf{u} + \nabla p = \mathbf{f}(\mathbf{x}, t) \quad \text{in} \qquad Q = \Omega \times (0, T),$$

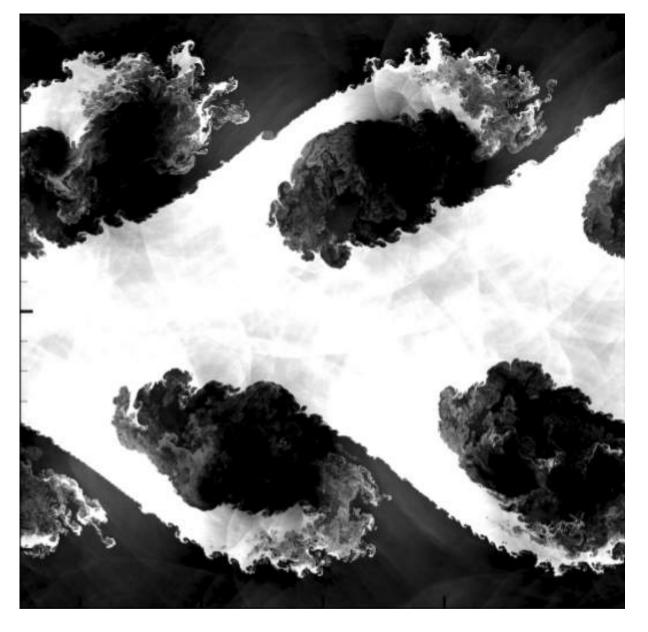
$$\nabla \cdot \mathbf{u} = 0 \qquad \qquad \text{in} \qquad \Omega \times (0, T),$$

$$\mathbf{u}(\mathbf{x}, t) = \mathbf{0} \qquad \qquad \text{on} \qquad \partial \Omega \times (0, T),$$

$$\mathbf{u}(\mathbf{x}, 0) = \mathbf{u}_0(x) \qquad \qquad \text{in} \qquad \Omega.$$

#### **Key focus areas**

- 1.High Performance Computing
- 2. Numerical Algorithms
- 3. Knowledge Extraction



Kelvin-Helmholtz Instability – First studied in 1871 Observed in engineering, geophysical, astrophysical phenomena

Showed 1810 results on Google Scholar for 2017!

A **simple** flow (two-dimensional) required the solution of 273X4 million ODES (MPI-Fortran, 192 processes, 410 wall clock hours). One snapshot of solution field (4 variables) - 21GB

#### **Interdisciplinary Research**

HPC – Primarily MPI
Signal Processing – Spectral,
Wavelet, Compressed sensing
Image Processing –
Deconvolution, Edge detection
Optimization – Krylov
Subspace Methods (for
Pressure Poisson Eq)
Data driven – PCA,
Transformed space methods,
inverse problems
ML – ANNs, Computer Vision

## Energy Flow in the Diffusive Regime; relating contact dynamics to energy flow.

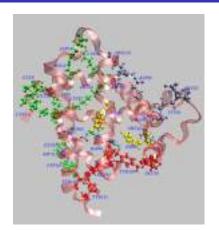


Figure: Long-range and long-lived, 150ps, residue-residue contacts.

#### Aims

- Relate energy flow through contacts with contact dynamics by a master equation.
- Investigate bound water's contribution to energy flow with emphasis on interface waters
- Oevelop easily to distribute software to extend this analysis to multi-protein environments

## How SDSC Summer Institute 2017 Will apply to my work.

- Utilize workflow management to streamline and create easily reproducible amber simulations.
- Implement dask everywhere! Time to get things done with multicore support!!!
- Implement CUDA programming in place of mpi code to accelerate energy flow calculations.
- Take advantage of the OpenMP framework and dive deeper into mpi.
- Most of all, use github so I can easily find changes and look at prior commits.

#### Bayesian Adaptive Design for Clinical Trials

- Large cardiovascular outcome trials (CVOTs) are commonly used in the evaluation of cardiovascular risk for new therapeutic agents intended for the treatment of Type 2 diabetes mellitus per US FDA guidance.
- These trials are large in size and can take years to complete.
- Would like to use information from already completed CVOTs in designing future CVOTs to provide a reasonable means to decrease the number of subjects required and/or time to complete future CVOTs.
- Such an approach requires halting the new CVOT and performing an interim analysis of whether the study needs to be continued or can be stopped.
- Determining when to halt and perform the interim analysis is a parameter that is calibrated using simulated datasets.

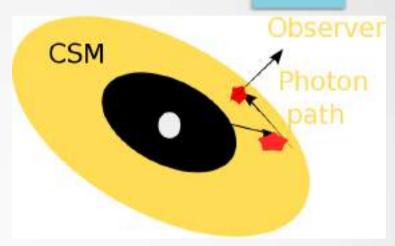
#### Computational aspect

- A simulated dataset is hundreds of thousands of simulated observations of patient data.
- Patient data includes things like an enrollement time, treatment indicator, covariates, etc.
- Simulating an observation of such patient data is independent of simulating any other observation and so can be easily parallelized.

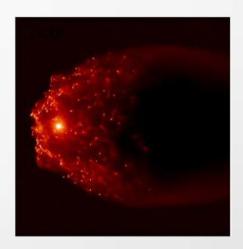
### Supernovae Line Polarization (SLIP)

#### -Manisha Shrestha

- Monte Carlo based radiative transfer code
- We get polarized flux as output.
- Need large number of photons for good signal to noise ratio.
- Going from analytic to SPH is computationally expensive.



Schematic of SLIP



Density distribution from SPH

## Dima Shyshlov

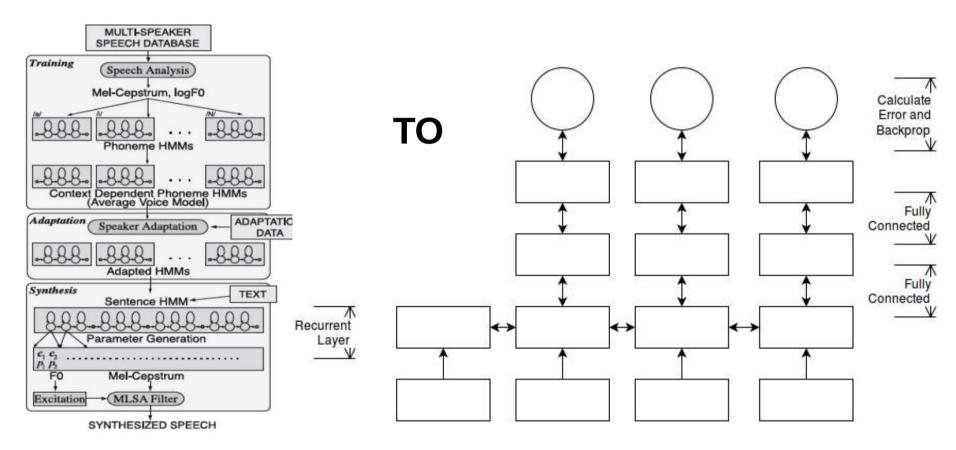
### HPC Consultant University of Arizona

#### Trends in UA HPC:

- Interest in GPU's
- Machine Learning
- Singularity (TensorFlow)
- Workshops



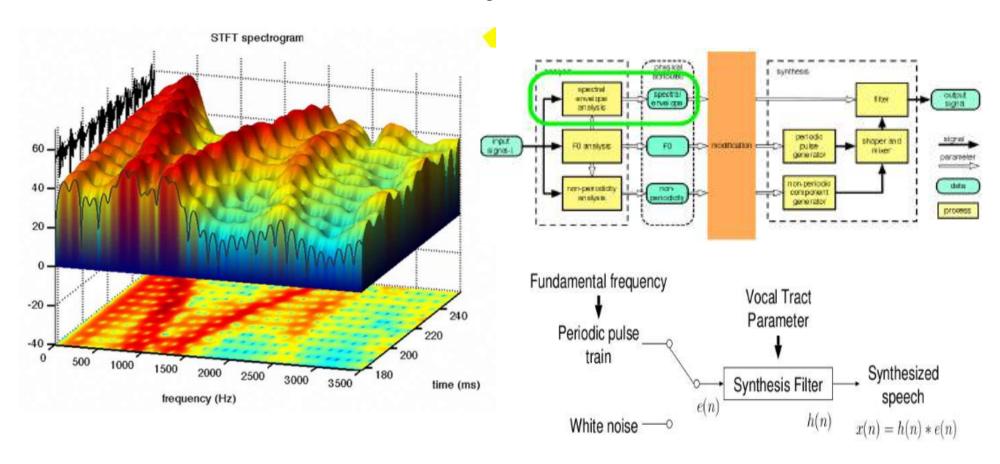
# Towards Hyper Efficient End-to-End RNN Speech Synthesis with Speaker Adaptation Research by Marcelo Siero



P100 GPU Comet nodes could allow fast training on many hours of training speech corpus by providing paralellism while using cuFFT, cuDNN libraries and more to convert HMMs technology to end-to-end RNNs. Use of Singularity containers may aid the task. On the right is a diagram of HTS, and HMM-based synthesizer.

See Demo of Speech Conversion and Speaker Adaptation at: http://FrankenThespian.com/demo

# Towards Hyper Efficient End to End RNN Speech Synthesis with Speaker Adaptation Research by Marcelo Siero



Better Visualization using **Visit** might create charts like the one on the left. Above right is a visualization describing the use of the STRAIGHT vocoder (H. Kawahara). It clearly shows quantization noise which the STRAIGHT vocoder is known to remove (smooth out). The right shows a block diagram of the STRAIGHT vocoder and the more simplified source / vocal tract filter model.

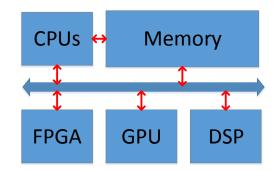
# Acceleration of Scientific Computing (collaborate with UCI Earth Science Dept.)

- Application
  - Climate Model in Weather Prediction (FastJ)
    - Radiative Transfer Equation
  - ...
- Performance Optimization
  - MPI, OpenMP, ...
  - Cache, loop-level optimizations, ...
  - GPU computing
    - CUDA, OpenACC programming

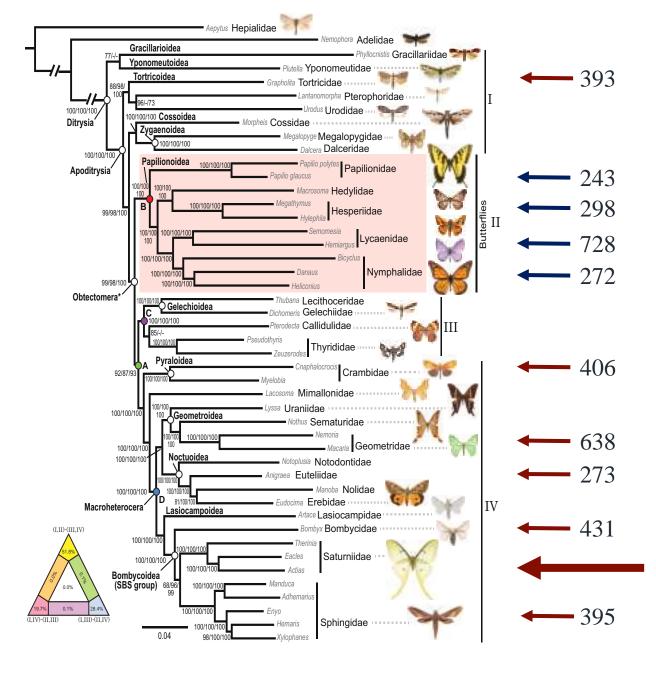
Know more from SDSC sessions

# Acceleration of Scientific Computing (collaborate with UCI Earth Science Dept.)

- Heterogeneous computing
  - Central processing unit (CPU)
  - Graphics Processing Unit (GPU)
  - Field-Programmable Gate Array (FPGA)
  - Digital Signal Processor (DSP)



- Design space exploration
  - Tons of combinations
    - Memory hierarchy/bandwidth
    - Resource utilization/power/energy consumption/ performance
  - Adopt machine learning to find the optimal solution \_\_\_\_\_



#### Lepidoptera Genomes

- ~25 assemblies (LepBase, NCBI)
  - 12 families; 8 moth species
  - 275 725 Mb







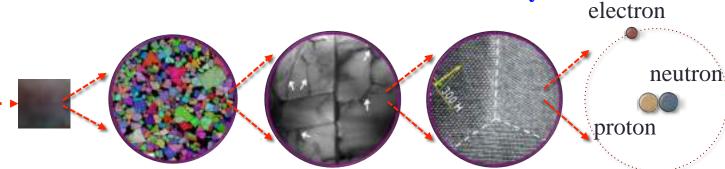
Kawahara and Breinholt (2014): Proc. R. Soc. B





Triton Statue @ UCSD

#### **Materials with Structural Hierarchy**



Macroscale  $(10^{-3} \text{ m})$ 

Microscale  $(10^{-6} \text{ m})$ 

Nanoscale  $(10^{-9} \text{ m})$ 

Atomistic  $(10^{-10} \text{ m})$ 

Electronic  $(10^{-15} \text{ m})$ 

#### **Experiments**



www.123rf.com

#### **Computer Modeling**

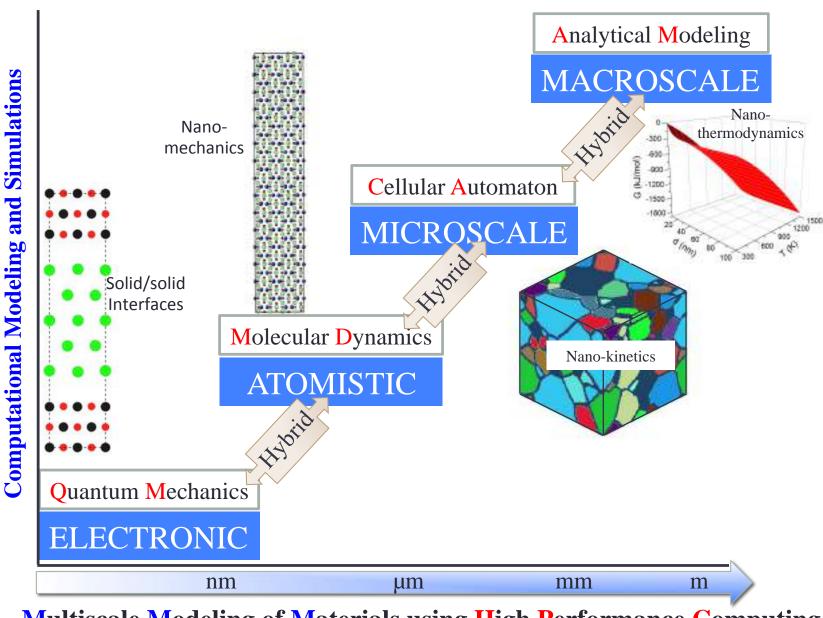


Understanding the effects of hierarchical structure can guide the synthesis of new materials tailored for specific applications.



Microstructure

**Nanomaterials** 



**Multiscale Modeling of Materials using High Performance Computing** 

The M<sup>3</sup> group: www.m3sdsu.com



## How many clinics at least does a study have to recruit in oder to detect a treatment effect with controlled level of error statistical significance?

Approximate the Distribution of Test Statistic with Simulation

Parallelization! Performance Optimization, OpenMP, MPI, Spark ...