## Making Software Engineering Work for Computational Science & Engineering: An Integrated Approach





## Jeffrey C. Carver George K. Thiruvathukal

1445344 1445347

## **Conceptualization of a Software Institute for High Energy Physics**

- High-energy Physics: Software & Computing enables our science
- Big challenges ahead for the High-Luminosity (HL-)LHC era
  - x10 projected shortfall of CPU & storage







- Advances in hardware will not get us there 
   need advances in Software!
- Community process → Strategic Plan for a HEP Software Institute

Strategic Plan for a Scientific Software Innovation Institute  $(S^2I^2)$ for High Energy Physics

Peter Elmer (Princeton University) Mark Neubauer (University of Illinois at Urbana-Champaign) Michael D. Sokoloff (University of Cincinnati)

December 20, 2017



P. Elmer, M. Sokoloff ACI-1558216, ACI-1558219

## Automated synchronization and boundary condition application for the Cactus framework Samuel Cupp, Steven Brandt, Peter Diener Louisiana State University

- Cactus Framework is an open-source environment for numerically solving Cauchy problems in parallel
- Current ghost zone synchronization and boundary condition application requires non-trivial, manual scheduling by programmers
- PreSync project replaces old system with an automated scheme
  - Tracks region of validity for grid functions (*interior* or *everywhere*)
  - Schedules synchronization and boundary conditions as needed
- PreSync reduces burden on users and programmers to understand inner workings of the Cactus Framework

We are supported by NSF Grant #1550551.



SI2-SSI:

Integrating Data with Complex Predictive Models under An Extensible Software Framework for Large-Scale Baye



- Software framework (Python/c++) for large-scale Bayesian inference
- Easy to use for both users and algorithm developers
- Combined capabilities of MUQ and hIPPylib

This work was partially supported by National Science Foundation grants ACI-1550487, ACI-1550547, and ACI-1550593.

MUO ModPieces

Abstr



Andreas C. Müller, Columbia Data Science Institute





### **Project Highlights**

- Symbolic computation computer algebra
- Expert Systems: toolboxes and libraries for domain scientists and educators
- Multiple domains: Differential geometry, Lie theory, general relativity and field theory, geometry of differential equations
- Vertically integrated, interdisciplinary curriculum development

## SI2-SSE: Development of a Software Framework for Formalizing ForceField Atom-Typing for Molecular Simulation



Christopher R. lacovella<sup>1</sup>, Peter Volgyesi<sup>2</sup> and Janos Sallai<sup>2</sup> <sup>1</sup> Department of Chemical and Bimolecular Engineering, Vanderbilt University, <sup>2</sup> Institute for Software Integrated Systems, Vanderbilt University

### VANDERBILT School of Engineering



### Challenge: Develop a general scheme to encode and apply forcefield parameter rules

- Forcefields describe the way atoms and collections of atoms interact via a set of adjustable parameters
  - Can contain thousands of sets that are differentiated by the chemical context of an atom, e.g,:
    - number of bonds, identity of bonded neighbors, local-environment of bonded neighbors, etc.
- Rules for usage are typically hard-coded into software as a deeply nested hierarchy with specific rule order
  - This approach can be difficult to debug, extend, and disseminate
- Defining parameter usage via SMARTS and overrides
- Encode chemical context using the SMARTS language for defining molecular patterns

 $opls_{135} = [C; X4](C)(H)(H)H$ 

- Set rule precedence via "overrides"

opls\_148 = [C;X4]([C;X3])(H)(H)H overrides=opls\_135

- Rules are both human and machine readable and can be tested for accuracy and completeness

## Foyer: General Python library for applying forcefields

- Atom types assigned using matching patterns determined by performing a subgraph isomorphism on the system graph
- Rules can be evaluated in any order
  - Uses a fixed point iterative scheme that creates white- and blacklists, rather than rigid hierarchy
- Source code does not change when rules change
  - Allows for easier testing, validation, versioning and dissemination



## SI2-SSI: Integrated Molecular Design Environment for Lubrication Systems (iMoDELS)



Peter Cummings<sup>1</sup>, Clare McCabe<sup>1</sup>, Ákos Lédeczi<sup>1</sup>, Gabor Karsai<sup>1</sup>, Adri van Duin<sup>2</sup>, Paul Kent<sup>3</sup> <sup>1</sup> Vanderbilt University, <sup>2</sup> Pennsylvania State University, and <sup>3</sup> Oak Ridge National Laboratory VANDERBILT School of Engineering



Challenge: Improved lubrication strategies required for devices with nanoscale separations

- Molecular simulation can be used to understand lubrication at the molecular level
  - Use this to screen for relationships between chemistry and tribology (i.e., lubrication properties)
- mBuild: a Hierarchical, Component Based Molecule Builder written in Python
- Construct complex systems from smaller, interchangeable pieces
- Enable programmatic variation of chemistry, required for screening
- Alkane mb.Polymer -CH<sub>2</sub> OUDIcated silica Duplicated silica Duplicated silica

import mbuild as mb

• metaMDS: define parameter landscape for screening



# Advancing Analysis for HEP





## **Improved Performance**

To reduce the time to scientific discovery and to enable more in-depth analyses, we are increasing the rate of access to ROOT data files. This includes streamlined access to simpler data types (uproot and BulkIO) and faster compression algorithms (LZ4 and ZSTD). These efforts have already provided factors-of-several improvements.



## **Bridging to Big Data**

"Big Data" software in industry, such as the Spark and scientific Python ecosystems, both complement and reproduce functionality of HEP software developed. To provide more options and reduce maintenance burdens, DIANA is building bridges between HEP software and the Big Data ecosystems: Spark-ROOT to Spark and uproot/OAMap to Numpy, Numba, and Dask.

## Statistical Techniques

We are developing tools and methods for statistical analysis in HEP, including research for simulatorbased inference (Carl), machine learning for particle physics (Scikit-Optimize), and software for efficient numerical computations.

## **High Level Tools**

We are therefore striving to present HEP analysis with higher-level interfaces. Scikit-HEP incorporates HEP techniques in Pythonic idioms, uproot provides access to ROOT data as Numpy and Pandas abstractions, and OAMap compiles object-centric user code into fast array operations.









## A Landlab-built cellular automaton model of hillslope evolution

Gregory E. Tucker<sup>1,2</sup>, Scott W. McCoy<sup>3</sup>, Daniel E.J. Hobley<sup>4</sup>

LANDLAB a python tookit for modeling earth-surface processes

 CIRES and Department of Geological Sciences, University of Colorado, Boulder 2 - Community Surface Dynamics Modeling System (CSDMS)
 Department of Geological Sciences and Engineering, University of Nevada, Reno 4 - School of Earth and Ocean Sciences, Cardiff University, Cardiff, UK





### Solving Polynomial Systems with PHCpack and phcpy

PHCpack is software for Polynomial Homotopy Continuation phcpy is a new Python package, available at www.phcpack.org

8

use case from the phcpy tutorial:



reproduces J. Mech. Design paper

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	<pre>total degree : 9</pre>			

### CRESCAT



### A Computational Research Environment for Scientific Collaboration on Ancient Topics

PI: David Schloen, University of Chicago

### Goals

- · Support all 5 stages of data for multi-disciplinary collaborative research
- Automate data transfers and transformations from one stage to the next via high-level GUI
- · Accommodate heterogeneity of data sources, types, and schemas while preserving the original ontologies
- · Seamless scalability for data management and algorithmic analyses
- · Ensure sustainability of software maintenance and technical support
- Test and document with complex use cases from
  - Archaeology
  - Paleontology  $\dot{\mathbf{x}}$
  - Historical linguistics
  - Ancient economics
  - Population genetics
  - Paleocliimatology etc.

### 1. Acquisition

- External curated data repositories via live links using their Web APIs
- Instruments and data files with support for many data types and file formats (2D images, 3D models, audio, video, geospatial, etc.)
- Manual entry with offline mode for field input and automated syncing of data when back online

### 4. Publication

- REST API exposes published data as XML with XSLT stylesheets to render it as JSON/HTML
- Sample Web apps provided for various research domains, to be customized as needed
- Secure, passwordprotected data controlled and published by owners

### 2. Integration

- Ontology-agnostic data warehouse stores both data and the ontologies inherent in the data
- XQuery DBMS optimized for hierarchies of atomic keyed data objects representing spatial, temporal, linguistic, and taxonomic relationships
- · Automatic parsing of source data to populate the integrated warehouse

### 5. Archiving

- OWL-RDF ontology specification documents the top-level (upper) ontology underlying the data warehouse
- · Can export RDF triples conformant to the OWL ontology, preserving all distinctions and relationships in the data, for use in other graph databases

### 3. Analysis

- Complex queries use hierarchical taxonomies with semantic inheritance
- · Statistical analysis and visualization via tightly integrated R server with data-aware console
- Geospatial mapping and analysis via ArcGIS Online and ESRI components

### Example Use Case







External databases are accessed via their Web APIs (e.g., ArcGIS Online for maps. Zotero for bibliographies)

External databases

For 2D images, 3D models, audio, video, documents, web pages, etc., accessed via their URIs.

Each project has its own server(s) for linked data while the data warehouse stores the URIs.



be published to a publication database as "flattened" XML and then styled as HTML, JSON, etc.

### Funded by NSF SI2-SSI award 1450455



Domain Software (SSE/SSI Projects)



Cyberinfrastructure + Domain Sciences



Science-Centric User Interfaces

# SciGaP Hosted Gateways

APACHE

AIRAVATA



POWERED BY



POWERED BY



Plug-in your allocations



Automated Metadata Extractons



Community Engagement



Community at large

## SI2-SSE: Scaling Up Science with the Cooperative Computing Tools Douglas Thain, University of Notre Dame



Total Cores

} [ for x in range(1,100) ]



## NIMBLE: Programmable Statistical Modeling for Hierarchical/ Graphical Models

### What do we want to do with hierarchical models?

- 1. More and better MCMC
- Many different samplers
- Better adaptive algorithms
- 2. Numerical integration
- Laplace approximation
- Adaptive Gaussian quadrature
- Hidden Markov models

### 3. Maximum likelihood estimation

- Monte Carlo EM
- Data cloning
- Monte Carlo Newton-Raphson

### 4. Sequential Monte Carlo

- **Auxiliary Particle Filter**
- **Ensemble Kalman Filter**
- **Iterated Particle Filter**

### 5. Normalizing constants

- Importance sampling
- Bridge sampling
- Others

### 6. Model assessment

- **Bootstrapping**
- Calibrated posterior predictive checks
- **Cross-validation**
- Posterior re-weighting
- 7. Idea cominbations
- PF + MCMC
- MCMC + Laplace/quadrature

### NIMBLE Components

- Domain-specific language (DSL) for statistical models 1.
  - We adopt and extend the widely-used BUGS language
- Domain-specific language embedded within R for model-generic 2. algorithms
- Code-generator (compiler) that generates C++ from the model and 3. algorithms DSLs.
  - C++ objects are managed from R by dynamically-generated interface classes
- Algorithm library (MCMC, SMC, etc.) 4.

### Core Team

Perry de Valpine (PI); UC Berkeley Christopher Paciorek (co-PI); UC Berkeley Daniel Turek; Williams College Nicholas Michaud; UC Berkeley Duncan Temple Lang; UC Davis



### SI2-SSE: High Performance Low Rank Approximation for Scalable Data Analytics

R. Kannan (ORNL), G. Ballard (WFU), B. Drake (GTRI), and H. Park (GAtech) https://github.com/ramkikannan/nmflibrary

Time (seconds)

10

5

**Constrained Low Rank Approximation** (CLRA) for Modeling Key Data Analytics problems of clustering, topic modeling, community detection, and hybrid clustering

Our current focus: Nonnegative Matrix/Tensor Factorization (NMF and NTF) and other Variants (e.g. Sparse NMF, SymNMF, and JointNMF) Why CLRA such as NMF and NTF? Utilize advances in numerical linear algebra algorithms and software, Behavior of algorithm easier to understand and analyze, Facilitates design of MPI based algorithms for scalable solutions PPoPP'16, TKDE'18, PPoPP'18, IPDPS'18, JGO'18

### Fast Alternating Updating NMF/NTF (FAUN) Framework:





1536

Number of Processes (p)



## **GraviT Distributed Ray Tracing Framework**

ACI-1339863 (TACC) ACI-1339840 (Oregon) ACI-1339881 (Utah)

Bring photo-quality rendering to your large-data visualizations through ray tracing, and now integrated into the SI2 yt project!





PIs: Paul Navrátil (TACC), Hank Childs (UO), Chuck Hansen (UU), Allen Malony (ParaTools)

SI2-SSE: Collaborative Research: Extending the Practicality and Scalability of LibMesh-Based Unstructured, Adaptive Finite Element Computations

**Paul Bauman** 



### A MACHINE LEARNING GATEWAY FOR SCIENTIFIC WORKFLOW DESIGN NSF SI2-SSE #1740151



Akos Ledeczi (PI) · Brian Broll · Tamas Budavari · Peter Volgyesi



**DeepForge** is an open source platform for **deep learning** designed for promoting **reproducibility**, **simplicity** and **rapid development** within diverse scientific domains.

The Science of High-Performance Computing Group



# Why you must visit our poster!

A modern dense linear algebra software stack

- BLIS: Framework for Rapid Instantiation of BLAS-like functionality
- libflame: LAPACK functionality
- TBLIS: A C++ tensor contraction library

Effective outreach

- Professional development for scientific software scientists
- Massive outreach through Massive Open Online Courses. (145,000 participants to date)
- Cultivation of external contributors







Alyssa Goodman, Pl Harvard University @AlyssaAGoodman



Michelle Borkin, Pl Northeastern University @michelle\_borkin



Thomas Robitaille Lead Architect @astrofrog





## Massively Parallel Solvers for Computational Fluid Dynamics on Block Structured Cartesian Grids

Jaber Hasbestan, Scott Aiton, Brenton Peck, Donna Calhoun, Inanc Senocak, Grady Wright\*; https://github.com/GEM3D



Highly scalable red-black binarizedoctree for generating and managing the adaptively refined grids



Refinement level	10	12	14	16
Red-black tree	3.3	21.14	69.75	145.87
Z-curve enhanced hash function	3.7	26.85	87.85	180.01
C++ STL default hash function	4.89	39.95	138.19	272.97





## Frank Tip

## College of Computer and Information Science, Northeastern University <u>www.franktip.org</u>

- modern applications rely on event handling for, e.g., user input, network communication
- key operations: register event handlers, emit events, call-back to event handler
- programmer errors are common, and lead to hard-to-debug failures
  - e.g., event race errors depending on nondeterministic scheduling of event handlers
- research goal: provide programmers with better tools to detect and repair such errors
  - based on static & dynamic program analysis



Hg. 4. (i) The benReces report for http://www.spple.com/, where the magnified part shows the warning, markers placed by lettRecist. (ii) The screen resulting from clicking on the search iron give: the page has barred, which is the normal letts dor. (iii) The screen resulting from clicking on the search iron byfor the page has fully leaded.

GeoVisuals Software: Capturing, Managing, and Utilizing GeoSpatial Multimedia Data for Collaborative Field Research

Ye Zhao

## **Collaborative RAPID**

**BUILDING INFRASTRUCTURE TO PREVENT DISASTERS LIKE HURRICANE MARIA** 

	OBJECTIVE 01 Water Quality Sampling Campaign	OBJECTIVE 02 Data Archive	OBJECTIVE 03 Cyberinfrastructure Advances
INFORMATION	Drinking water samples from public streams Spatially aggregated anonymized information of the impact zone	Baseline assessment: Population Health Data, Healthcare Providers and supporting organizations, natural system environmental variables, Public Water System location and infrastructure status. Hurricane Maria health and environmental data from public data repositories and Luquillo CZO instruments in El Yunque National Park	LANDLAB raster model grid and diverse data formats
INFORMATION	PRASA Utility, community operated tank system, household data Teacher collection of student health data (IRB)	Water samples with personal information De-identified water samples that can be geo-located	Population health researcher user-testing Water quality professionals and researchers user testing Individual data owners user testing

## Expected Science Outcomes

**DISASTER:** 

Contamination, drought, landslides, bio-diversity

DRINKING WATER: Geographic location and use data

HUMAN IMPACT: Spatial distribution of contamination or drought

## PAPI-EX

Performance Application Programming Interface for Extreme-scale Environments SI2-SSI-1450122

- Performance Measurement Library
- Cross-platform
- Widely used in Supercomputing Environments
- Find Bottlenecks in your code!
- Measure raw performance, architectural effects (Cache, Branch Predictor, etc.), Power and Energy
- Supports most modern computing hardware
- Companion tools: PAPI-ex, Counter Inspection Toolkit



Jack Dongarra, Heike Jagode, Anthony Danalis

University of Tennessee



Vince Weaver

University of Maine



### SI<sup>2</sup>-SSE: Foundations for MATP©WER as an Extensible Tool for Power Systems Research and Education

Ray Zimmerman, Cornell University

### What is MATPOWER?

- Set of free, open-source, Matlab language tools
  - compatible with MATLAB® and GNU Octave
- For steady-state power system simulation and optimization, including:
  - power flow (PF)
  - extensible, optimal power flow (OPF)

### **MATPOWER's Unique Combination**

- free, open-source license (BSD)
- code that is easy to understand, customize
- state-of-the-art, high performance solvers
- ready-to-use realistic data included

MATPOWER boosted to de facto standard

- benchmark platform for power systems research
- educational tool for power systems engineers and optimization

## **Project Overview**

Expand MATPOWER's future impact as a successful **research-enabling tool** for the problems of the power systems of the future by providing the **project infrastructure** and **core software architecture** needed to facilitate ongoing community-supported growth.

### MATPOWER Project Infrastructure

• Transition to fully collaborative **open development paradigm** with, public code repository, issue tracker, user and developer forums, contributor guidelines, public list of project descriptions

### MATPOWER Core Software Architecture

 Redesign core software around a general modular architecture to enable more flexible user customization and facilitate significant user contributions, while retaining and enhancing the simplicity that makes it attractive in education CRII: OAC: A Hybrid Finite Element and Molecular Dynamics Simulation Approach for Modeling Nanoparticle Transport in Human Vasculature

Ying Li

### STAMLA: Scalable Tree Algorithms for Machine Learning Applications

#### Summary

A software architecture challenge to design a unified set of high performance tree abstractions.





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## SI2-SSE: C11Tester: Scaling Testing of C/C++11 Atomics to Real-World Systems

Brian Demsky, University of California, Irvine

- Modern programming languages provide atomic operations
- Atomic operations:
  - Make it possible to build faster, more scalable data structures with stronger guarantees
  - Expose developers to complex behaviors that arise from CPU & compiler optimization
  - Are extremely difficult to use correctly
- C11Tester project is building tools to help developers effectively test code with atomic operations





Engineering and Physical Sciences Research Council



A Joint EPSRC-NSF Software Project



Bringing higher end computational tools to the bench scientist to accelerate the discovery process.

Current grant coming to a close.

Working on transitioning to Community efforts and how to coordinate new efforts going forward.

Several new projects being proposed -- plus

- Networking/workshop grants
  - COST action proposal in Europe
  - looking at various US opportunities
  - Nurture involvement from major facilities

OTHER IDEAS WELCOME





The project includes (left) growth and characterization, (middle) iterative modeling, and (right) design training and validation. Single-frame red boxes represent experimental samples and data, while double-framed blue boxes represent computational products. The shaded region in the middle represents the application of particle swarm optimization. The general flow can be understood as: (1) growth of samples varied by composition and growth procedures; (2) experimental structural characterization; (3) iterative model simulation using characterization data; (4) ANN training to link simulation and growth parameters followed by predictive application of the ANN.

### Hearing the Signal through the Static: Realtime Noise Reduction in the Hunt for Binary Black Holes and other Gravitational Wave Transients Sydney Chamberlin<sup>1</sup>, Reed Essick<sup>2</sup>, Patrick Godwin<sup>1</sup>, Chad Hanna<sup>1</sup>, Erik Katsavounidis<sup>3</sup>, Duncan Meacher<sup>1</sup>, Madeline Wade<sup>4</sup>

<sup>1</sup>The Pennsylvania State University, University Park, PA, 16801 <sup>2</sup>University of Chicago, Chicago, IL 60637 <sup>3</sup>Massachusetts Institute of Technology, Cambridge, MA 02139 <sup>4</sup>Kenyon College, Gambier, OH 43022

Real-time GW searches are plagued by "glitches". E.g., GW170817 - a binary neutron star merger - had a delayed alert because we had to deal with data quality issues. Goal: use machine learning to classify glitches in real-time in based on auxiliary information like seismometers, magnetometers, etc. Currently can reject <sup>2</sup>/<sub>3</sub> of the glitches with a 1% false dismissal. Working to make it even better.





## RADICAL-Cybertools: Building Blocks for Workflow System Middleware



### Overview

**Motivation:** Sophisticated and scalable workflows have become essential for advances in computational science. In spite of the many successes of workflow systems, there is an absence of a reasoning framework for end-users to determine **which** systems to use, **when** and **why**. Workflows are increasingly a manifestation of the algorithmic and methodological advances; workflow users and workflow system developers are often the same. Workflow systems must be easily extensible so as to support diverse functionality and the proverbial "last mile customization".

We advance the science of workflows and prevent workflow system "vendor lockin" by formulating a **building blocks** approach to middleware for workflow systems grounded on four design principles of **self-sufficiency**, **interoperability**, **composability**, and **extensibility**. A building block has: (i) one or more modules implementing functionalities to operate on a set of explicitly defined entities; and (ii) two well-defined and stable interfaces, one for input and one for output.

#### Properties of building blocks

- Self-sufficiency: design does not depend on the specificity of other building blocks
- Interoperability: can be used in diverse system architectures without semantic modifications
- Composability: its interfaces enable communication and coordination with other building blocks
- Extensibility: its functionalities and entities can be extended to support new requirements or capabilities

### RADICAL-Cybertools: An implementation of the Building Block Approach to Middleware

RADICAL-Cybertools are designed and implemented in accordance with the building block approach, spanning four functional levels:

- (L4) Workflow and Application Description: Requirements and semantics of applications and workflows.
- (L3) Workload Management System (WLMS): Applications devoid of semantic context are expressed as workloads.



### (L2-L1) Interface to Resource

**RADICAL-SAGA** (*Simple API for Grid Applications*): Provides an interoperability layer that lowers the complexity of using distributed infrastructure whilst enhancing sustainability of distribut- ed applications, services, and tools in the form of a Python API. By abstracting away the heterogeneity of the underlying systems, RADICAL-SAGA simplifies access to many distributed cyberinfrastructures such as XSEDE and OSG.

### (L2) Task Runtime Management

**RADICAL-Pilot:** Scalable pilot system for the simple and versatile execution of concurrent and distributed many-task applications on clusters, grids, and clouds. RADICAL-Pilot offers users a lightweight Python API to handle a variety of workloads—including MPI, multiprocess, multithreaded, CPU, and GPU tasks—and scheduling O(10k) tasks while marshalling O(10k) distributed cores.



### (L3) Workload Management

**Ensemble Toolkit:** Provides the ability to execute flexible combinations of **ensemble- based applications** on high-performance distributed computing resources. Ensemble Toolkit takes charge of where and how the workload is distributed: users only have to worry about what to run and when.



### (L4) Applications and Scientific Workflows

**ExTASY:** Enables sampling of complex macromolecules with molecular dynam- ics. It supports **high-performance** and **high-throughout** execution of molecular dynamic calculations, and analysis tools that provide runtime control over a simulation.

**HTBAC:** Enables the scalable, adaptive and automated calculation of the binding free energy on high-performance computing resources.



**RepEx:** Enables performing Replica Exchange simulations at a scale which is not attainable by stand-alone molecular dynamics applications. It uses RADICAL-Pilot for workload execution.

**ICEBERG:** Enables scalable image analysis on high-performance distributed computing for geoscience research. It provides a library based on extensible building-blocks that allows the integration of frameworks and algorithms seamlessly.

### Integration with existing systems

#### SeisFlows

• Supports seismic inversion workflows on HPC machines, at scale

#### • We integrated SeisFlow

- with RADICAL-SAGA (L1) to execute compute jobs
- with RADICAL-EnTK (L3) to orchestrate tasks and data staging

#### Atlas (Panda and Harvester)

- PanDA is a WMS designed to support the distributed execution of workflows via pilots.
- Harvester is a service which provides pilot and workload management to Panda
- We integrated **Panda** and **RADICAL-Pilot** to improve its scaling on large HPC resources, and integrated **Harvester** and **RADICAL-Pilot** to provide scalable task execution on HPC machines

Swift

- Swift is a language and a runtime system to execute workflows.
- We integrated **Swift** with **RADICAL-WLMS** (L3) to execute workloads concurrently on HPC and HTC resources.

Fireworks

- Fireworks is a system that enables material science workflows
- We integrate Fireworks and RADICAL-Pilot (L2) to improve its scaling on HPC resources

### Large-Scale Causal Structure Learning

**W** CDS&E: Statistical Methods for Discrete-Valued High-Dimensional Time Series

UNIVERSITY of WASHINGTON

Ali Shojaie





## SI2-SSE: ShareSafe: A Framework for Researchers and Data Owners to Help Facilitate Secure Graph Data Sharing

**Raheem Beyah**