



### April 2016 X-Stack PI Meeting Update

Vivek Sarkar Rice University September 21, 2016



### Outline

Background on X-Stack Program

• X-Stack PI meeting, April 6-7, 2016

• Conclusions



### X-Stack Program & Exascale Research Challenges

- 1. Energy efficiency
- 2. Interconnect technology
- 3. Memory Technology
- 4. Scalable System Software
- 5. Programming systems
- 6. Data management
- 7. Exascale Algorithms
- 8. Algorithms for discovery, design, and decision
- 9. Resilience and correctness
- 10. Scientific productivity

*Red: Central focus Blue: Significant focus Green: Coordinated efforts* 





Sponsored by the U.S. Department of Energy, Office of Science, Office of Advanced Scientific Computing Research



X-Stack Program



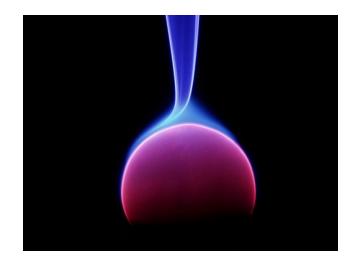
- Program Manager: Sonia R. Sachs
- DOE ASCR Research Director: William Harrod
- Program wiki: <u>https://xstackwiki.modelado.org/Extreme\_Scale\_Software\_Stack</u>
- Background
  - Community input collected in two workshops held in 2011 prior to FOA
  - FOA topics: Programming models, languages, compilers, runtime systems, and tools that address identified Exascale challenges (FOA deadline: February 6, 2012)
  - 67 full proposals: 24 Lab proposals, 36 university proposals, 7 industry proposals
- Portfolio
  - Target funding for program: \$15M/year for FY12 FY15, \$12M/year for FY16
  - 9 projects were funded for 3 years, September, 2012 September 2015
    - 7 projects were extended for one additional year until September 2016
  - 2 more projects added for September 2013 September 2016
  - 1 more project added for June 2014 September 2016



### **Goals of X-Stack Research Program**

- Programming Systems: new approaches to managing parallelism, locality and data movement through innovations in programming interfaces
- Runtime Systems: new approaches to performance portability, and adaptation to changing application goals and system conditions
- Performance and Debugging tools: enabling end user productivity and performance
- Interoperability: facilitate interoperability across different HPC languages and interfaces, as well as 9/2Criposs-cutting execution models Update (V. Sarkar)







### 10 current projects in X-Stack Portfolio



#### **DEGAS** (PI: Kathy Yelick)

Hierarchical and resilient programming models, compilers and runtime support.



#### Traleika Glacier (PI: Shekhar Borkar)

Exascale programming system, execution model and runtime, applications, and architecture explorations, with open and shared simulation infrastructure.



#### **D-TEC** (PI: Dan Quinlan and Saman Amarasinghe)

Complete software stack solution, from DSLs to optimized runtime systems code.

#### **XPRESS** (PI: Ron Brightwell)

Software architecture and interfaces that exploit the ParalleX execution model, prototyping several of its key components.





#### X-Tune (PI: Mary Hall)

Unified autotuning framework that integrates programmer-directed and compiler-directed autotuning.



THE

UNIVERSITY

OF UTAH

#### **CORVETTE** (PI: Koushik Sen)

Automated bug finding methods to make concurrency bugs and floating point behavior reproducible.



#### **SLEEC** (PI: Milind Kulkarni)

Semantics-aware, extensible optimizing compiler technologies.

#### **PIPER** (PI: Martin Schultz)

Tools for debugging and analysis of performance, power, and energy.

#### Vancouver 2 (PI: Jeffrey Vetter)

Heterogeneous computing: abstractions, runtime systems, tools and low-level libraries

#### **ARES** (Pat McCormick and Jeffrey Vetter)

High-level intermediate representations (HLIR) and optimizations to select architectures





- ASCR Exascale Programming Challenges Workshop (Marina del Rey, July 2011)
  - <u>http://science.energy.gov/ascr/research/computer-science/programming-challenges-workshop/</u>
- ASCR Exascale Tools Workshop (Annapolis, October 2011)
  - <u>http://science.energy.gov/ascr/research/computer-</u>
- Exascale Research Conference (Anna
  - Included other ASCR exascale research
  - <u>http://exascaleresearch.labworks.org/oc</u>
- Programming Models & Environmenter
  - https://xstackwiki.modelado.org/01

Runtime System Summit \_\_\_\_\_\_\_\_\_ Joington D.C., April 2014)

- <u>https://xstackwii...modelado.org/10.17.2014\_Runtime\_Systems\_Summit</u>
- 2015 Programming Models and Environments Workshop (Rockville, March 2015)
  - <u>http://www.orau.gov/programming2015/</u>
- 2015 Runtime Systems Workshop (Rockville, March 2015)
  - <u>http://www.orau.gov/runtimesys2015/</u>
- NOTE: above web sites also include links to published workshops & summit reports

Presented by Kathy Yelick in July 2015 ASCAC meeting

Programming Models %26 Environments Summit



### X-Stack PI Meetings

- X-Stack Kickoff PI meeting:
  - <u>https://xstackwiki.modelado.org/9/17/12:\_X-</u>
    <u>Stack\_Portfolio\_Kickoff\_Meeting</u>
- 2013 X-Stack PI meeting:
  - <u>https://xstackwiki.modelado.org/3/20/13 X-Stack\_PI\_Meeting</u>
- 2014 X-Stack PI meeting:
  - <u>https://xstackwiki.modelado.org/05/</u>
    <u>Stack PI Meeting</u>
- 2015 X-Stack PI meeting (combined with Osmeeting):
  - <u>https://xstackwiki.modelado.org/P\_\_\_\_\_oer\_7-</u>
    8, 2015 X-Stack and OS/R\_P\_\_\_\_\_eting
- 2016 X-Stack PI meeting:
  - <u>https://xstackwiki.modelado.org/April\_6-7, 2016 X-Stack\_PI\_Meeting</u>



# Focus of today's presentation



Marriott North Bethesda, MD



### Outline

• Background on X-Stack Program

• X-Stack PI meeting, April 6-7, 2016

• Conclusions



### Meeting summary

- Dates: April 6-7, 2016
- Location: LBNL
- Organizing Committee:
  - Vivek Sarkar (Chair)
  - Saman Amarasinghe
  - Dan Quinlan
  - Kathy Yelick
- ~ 109 participants
  - 36 lab participants, 36 industry participants, 37 university participants
- Special thanks to LBNL, NERSC, ASCR, ORISE staff for help and support with all meeting logistics
- Meeting web site:
  - <u>https://xstackwiki.modelado.org/April 6-7, 2016 X-Stack PI Meeting</u>



### **NERSC News about X-Stack Software Demonstrations**



Powering Scientific Discovery Since 1974

Home » News & Publications » News » Center News » Berkeley Lab Hosts Fourth X-Stack PI Meeting

#### Berkel ey Lab Host's Fourth X-Stack P Meeting Application code demos utilized more than 1,000 nodes on NERSC supercomputers

APRIL 25, 2016 Contact: Kathy Kincade, <u>kkincade@bl.gov</u>, +1 510 495 2124

Berkeley Lab hosted the fourth annual X-Stack PI meeting April 6 and 7, wher e X-Stack researchers, the facilities teams, application scientists and developers from national laboratories, universities and industry met to shar e the latest developments in X-Stack application codes and identify further modifications.

X-Stack was launched in 2012 by the U.S. Department of Ener gy's Advanced Scientific Computing Research program to support the development of exascale softwar e tools, including programming languages and libraries, compilers and runtime systems, that will help programmers handle massive parallelism, data movement, heter ogeneity and failures as the scientific community transitions to the next generation of extr eme-scale supercomputers. A total of nine <u>X-Stack programs</u> were designated to develop complete solutions that addr ess multiple components of the system softwar e stack: DEGAS, D-TEC, XPRESS, Traleika, DynAX, XTUNE, GVR, CORVETTE and SLEEC.



A Technology Marketplace held A 6 during the X-Stack at Berkeley Lab meeting gave application developers the opportunity to demo the softwar e prototypes

During the first three years of the program, these projects have completed research and development of programming models, programming environments and runtime systems for exascale. During the fourth year, which began in September 2015, the development teams are extending their results and developing additional benefits for the application codes.

The goal for this year's X-Stack PI meeting was to demonstrate the latest advances in the codes, with an eye towar d delivery in the latter part of 2016. Toward this end, a Technology Marketplace held during the April meeting gave developers the opportunity to demo the softwar e prototypes; a total of 20 demonstrations were given during the two-



### **OLCF** News about X-Stack Software Demonstrations

**TECHNOLOGY** - Written by OLCF Staff Writer on May 31, 2016

### X-Stack Projects Use Titan's GPUs for Demos

mm

(intel)

BERKELEY LAB

Tags: DSL, GPUs, Titan, X-Stack



Project teams demonstrate their research in programming environments for future exascale systems

One of the unique aspects of the Oak **Ridge Leadership Computing Facility's** (OLCF's) Titan supercomputer is its hybrid architecture, consisting of both CPUs and GPUs. Recently, those GPUs played a big role in helping advance US Department of Energy (DOE)-funded scientific discovery.



**DEGAS** (Kathy Yelick)

runtime support.

Traleika (Shekhar Borkar)

Hierarchical and resilient PGAS

across nodes), compilers and

applications, and architecture

simulation infrastructure.

programming models (within and

#### X- Stack: the present

www.stackwiki.modelado.org

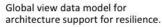


**PIPER (Martin Shultz)** Tools for debugging and analysis of performance, power, and energy

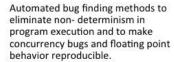
X-Tune (Mary Hall)

Unified autotuning framework that integrates programmer-directed and compiler-directed autotuning.

GVR (Andrew Chien)



CORVETTE (Koushik Sen)



SLEEC (Milind Kulkarni)

Semantics-aware, extensible optimizing compiler that treats compilation as an optimization problem.



- D-TEC (Dan Quinlan and Saman Amarasinghe) Complete software stack solution, from DSLs to optimized runtime systems code.
- XPRESS (Ron Brightwell) Software architecture and interfaces that exploit the ParalleX execution model, prototyping several of its key components.





### Meeting Agenda: Day 1 (April 6, 2016)

#### Day 1 Goals

- Review X-Stack Portfolio share latest research results in presentations and demonstrations
- Understand successes and challenges in adoption of new software technologies in HPC Facilities

#### Panel (1 hour)

 "Successes & challenges in adopting new software technologies in HPC facilities", panel discussion with Facility representatives

#### **Technology Marketplace (2 hours)**

 18 X-Stack Project Technology Demonstrations
 9/21/16

#### **Project presentations (5.5 hours)**

- DEGAS (Yili Zheng)
- D-TEC (Dan Quinlan, Saman Amarasinghe)
- Traleika Glacier (Josh Fryman)
- XPRESS (Ron Brightwell)
- PIPER (Todd Gamblin)
- SLEEC (Milind Kulkarni)
- Corvette (Koushik Sen)
- X-TUNE (Mary Hall)
- Vancouver & ARES (Jeff Vetter)



### Project Summaries

• <u>DEGAS</u>: Build a PGAS programming environment and toolkit that delivers high performance and productivity to DOE applications on current and future systems.

**Impact:** <u>https://xstackwiki.modelado.org/images/0/09/DEGAS-Highlight\_Summary.pdf</u>

• <u>D-TEC</u>: Simplify the development of DSLs to enable scalability, migration, resiliency, verification on current and future hardware platforms.

**Impact:** <u>https://xstackwiki.modelado.org/images/9/99/D-TEC\_Summary\_Highlight.pdf</u>



**DEGAS Project:** Impact of advances in data Structures and Runtime Support for Irregular Data-Intensive Applications

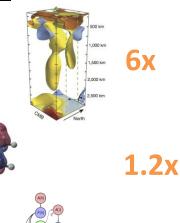
- Distributed hash table
  Applications: HipMer (genomics)
- Irregular data exchange
  Applications: AMR, HPGMG
- Irregular global matrix update
  - Applications: NWChem, seismic tomography
- Distributed work queue
  - Applications: NWChem, Hartree-Fock
- Dynamic task graph
  - Applications: Sparse symmetric matrix solver





**Speedups** 

**1.2**x

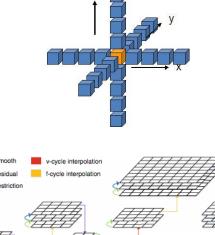


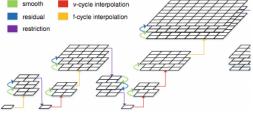
2х

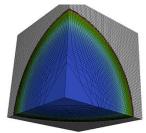


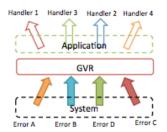
### **D-TEC Project:** Impact of advances on DSL technologies, compilers and runtime systems

- AMR Shift Calculus DSL with ROSE/Polyopt
  - 7.9x for 3D 125 pts stencil
  - 7.3x for 2D 81 pts stencil
- Halide DSL
  - 4.25x for MiniGMG
  - 1.8x on GPU for HPGMG
- Bamboo
  - 1.27x in 32K size for algebraic multigrid
  - 1.29x with 96K grid cells for 3D stencil
- LULESH with X10
  - 1.12x better performance
  - 40% fewer lines of code
- Global-View Resilience (GVR)
  - 85% parallel efficiency on 1K processes with less than 2% code change











### Project Summaries (contd)

• <u>Traleika Glacier</u>: Explore new introspective event-driven execution model embodied in an Open Community Runtime, and evaluate its effectiveness in mapping extreme parallelism on future hardware with open and shared simulation infrastructure.

Impact: <a href="https://xstackwiki.modelado.org/images/2/21/Traleika\_Glacier\_Impacts.pdf">https://xstackwiki.modelado.org/images/2/21/Traleika\_Glacier\_Impacts.pdf</a>

• <u>XPRESS</u>: Prototype implementation of software stack (OpenX) to support the ParalleX Execution Model with HPX runtime system, LXK lightweight operating system, with support for legacy MPI and OpenMP codes.

**Impact:** <u>https://xstackwiki.modelado.org/images/7/78/XPRESS-Highlights\_Summary.pdf</u>

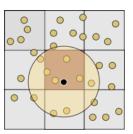
# **EXAMPLE 1** Office of Science **Traleika Glacier Project:** The Open Community Runtime

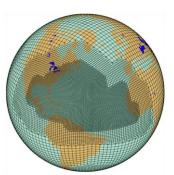
### Software Suite and its Impact on Applications

Open

Community Runtime

- Applications: Full set of DOE proxies and the full app atmospheric circulation, Tempest, Partial list of real applications on OCR
  - Tempest
  - SCF from NWCHEM
  - CoMD
  - HPCC and HPCG kernels
  - Lulesh (multiple versions)
  - miniAMR
  - HPGMG **11x**
  - Genomics Smith-Waterman 9x
- Full OCR API supported on real hardware and is exploited by these tool chains
  - C library, C++library
  - CnC on OCR, Hierarchically Tiled Arrays (HTA) on OCR
  - Compiler generation of OCR calls (R-Stream)
  - Habanero-C language on OCR







Please see: https://xstack.exascale-

tech.com/wiki/index.php/Main\_Page#Traleika\_Glacie r\_Research\_Products and https://xstack.exascaletech.com/wiki/index.php/Traleika\_Glacier\_Software Releases

for details, products and research successes



- **N-body Simulation**
- Mini-Ghost: Boundary Exchange Mini-app
- Kernels: Stream benchmark, Matrix transposition
- Distributed GPU work
- Lulesh: Shock Hydrodynamics
- DSEL and MTL for HPX
  - Same Portable code GPU / CPU

or linear algebra through DOF NNSA DE-NA0002377 (PSAAP2

**1.2x** over MPI on Cori (128 cores) **Same** as MPI on Cori (4k cores)

**Same** as MPI (256 cores)

Photon: Integrated Communication Library



**1.34x** for 16 byte puts **1.37x** for 16 byte gets over MPI-3 one-sided



1.5x over native CUDA on 16 GPUs

2.5x over MPI+OpenMP

1.4x over OpenMP

1.13x over MPI+OpenMP (1024 cores)

<u>Comparisons/Results</u>

**1.4x** over MPI (16,384 cores)



### Project Summaries (contd)

 <u>PIPER</u>: Performance analysis for the X-Stack that provides insights into application performance, enabling users and runtimes to act on these insights.

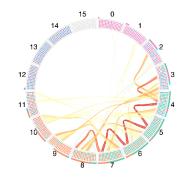
**Impact:** <u>https://xstackwiki.modelado.org/images/b/b8/PIPER-Impact\_summary.pdf</u>

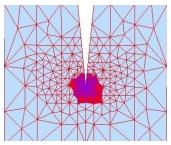
• <u>SLEEC</u>: Improve application performance by leveraging domain knowledge in the form of library annotations, and semantics-aware, extensible optimizing compiler technologies.

Impact: <a href="https://xstackwiki.modelado.org/images/b/b9/SLEEC-Highlight\_summary.pdf">https://xstackwiki.modelado.org/images/b/b9/SLEEC-Highlight\_summary.pdf</a>

<u>Corvette</u>: Improved debugging of scientific applications via automated bug finding methods, and making concurrency bugs and floating point behavior reproducible.

**Impact:** <u>https://xstackwiki.modelado.org/images/4/4c/Corvette-highlight\_summary.pdf</u>









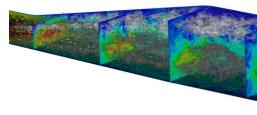
### Project Summaries (contd)

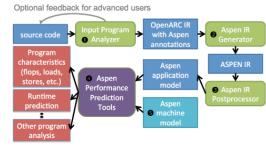
- <u>X-TUNE</u>: Use auto-tuning to enable performance and software portability to map simple code specification to optimized implementation for a given platform.
   Impact: <a href="https://xstackwiki.modelado.org/images/d/de/Xtuneimpact\_summary.pdf">https://xstackwiki.modelado.org/images/d/de/Xtuneimpact\_summary.pdf</a>
- <u>Vancouver 2</u>: Software infrastructure (compilers, libraries, performance tools) for productive heterogeneous exascale computing.

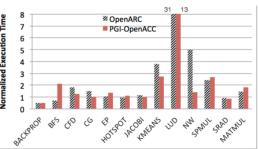
**Impact:**<u>https://xstackwiki.modelado.org/images/5/57/Vancouver-</u> <u>highlight\_summary-v02.pdf</u>

 <u>ARES</u>: Abstract representations for the extreme-scale stack leveraging the widely adopted LLVM infrastructur Impact:<u>https://xstackwiki.modelado.org/images/3/33/Ares-highlight\_summary-v02.pdf</u>

https://xstackwiki.modelado.org/images/b/ba/X-Stack\_Impact\_Summary\_-\_September\_2016.pdf









### X-Stack Publications & Software Releases

- Total publications ~ 400
  - Includes top-tier Computer Science venues, e.g.,
  - SC'12, ICS'13, PLDI'13, ASPLOS'14, IPDPS'14, PLDI'14, OOPSLA'14, SC'14, PPoPP'15, CGO'15, ASPLOS'15, IPDPS'15, ICS'15, PLDI'15, IPDPS'16
- Total software products ~ 200
- For details,

see:<u>https://xstackwiki.modelado.org/Extreme\_Scale\_Softwar</u> <u>e\_Stack#X-</u> <u>Stack\_Program\_Software\_and\_Publications\_per\_Project</u>



### **Facilities Panel**

- "Successes and Challenges in adopting new software technologies in HPC Facilities"
- Participants
  - Katie Antypas (LBNL)
  - David Bernholdt (ORNL)
  - Hal Finkel (ANL)
  - Gustav Jansen (ORNL)
  - Matthew Norman (ORNL)
  - Prabhat (LBNL)
- Observations
  - Facilities staff install new software all the time, but can only justify doing so when there is a critical mass of users
  - Simplified tool chain (e.g., libraries) and training resources are important enablers for transitioning research software to use in facilities



### Meeting Agenda: Day 2 (April 7, 2016)

#### Day 2 Goals

- Insights on application challenges from keynote speakers
- Five breakout groups to discuss future CS research topics
- Report back from breakout groups + wrap-up

#### Application presentations (2 hours)

- Next Generation AMR (Ann Almgren)
- Future Programming Challenges for DOE (David Richards)
- The Importance of DSL Technology (Paul Woodward)
- Distributed Learning Dynamics Convergence (Alex Bayen)

#### Breakout groups & report back (6 hours)

- Future Synergies in Programming Systems for Data-Intensive and Compute-Intensive Science. Moderator: Vivek Sarkar
- 2. Programming Systems for Data Centric Computing: Demands from User facilities, experiments and sensor networks. Moderators: Dan Quinlan and John Wu
- Programming Systems Support for Post Moore's Computing. Moderators: Jeff Vetter and Bob Lucas
- 4. Ensuring Correctness for Exascale and Beyond. Moderators: Benoit Meister and Koushik Sen
- 5. High Performance Languages. Moderator: Saman Amarasinghe

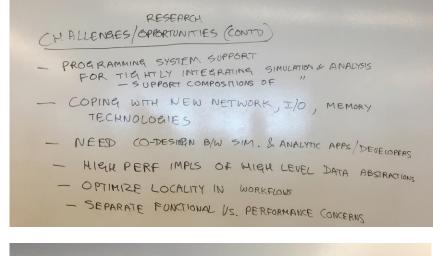


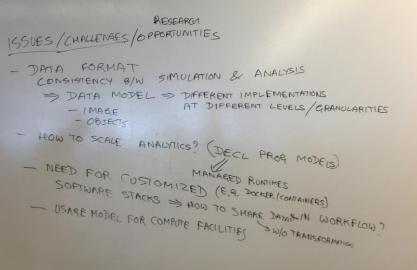
## Summary of Breakout 1 on "Future synergies in programming systems for data-intensive and compute-intensive science"

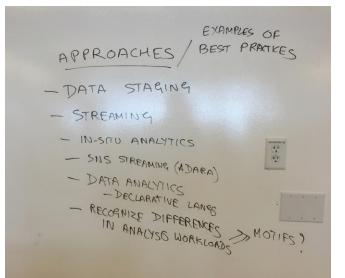
- Exploiting synergies between data-intensive and compute-intensive computations is critical for future HPC applications
- Early experiences point to potential benefits
- Multiple research opportunities, including:
  - HPC data models and implementations
  - Programming systems for integration of simulations and analytics
  - Addressing new scalability and performance bottlenecks
  - Scalable integration of customized software stacks for science workflows
- ~ 20 participants

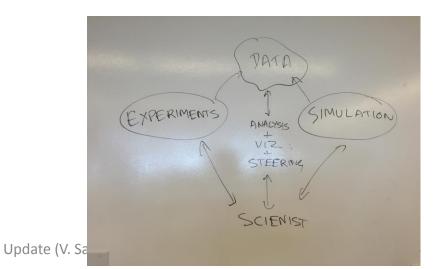


## Summary of Breakout 1 on "Future synergies in programming systems for data-intensive and compute-intensive science" (contd)



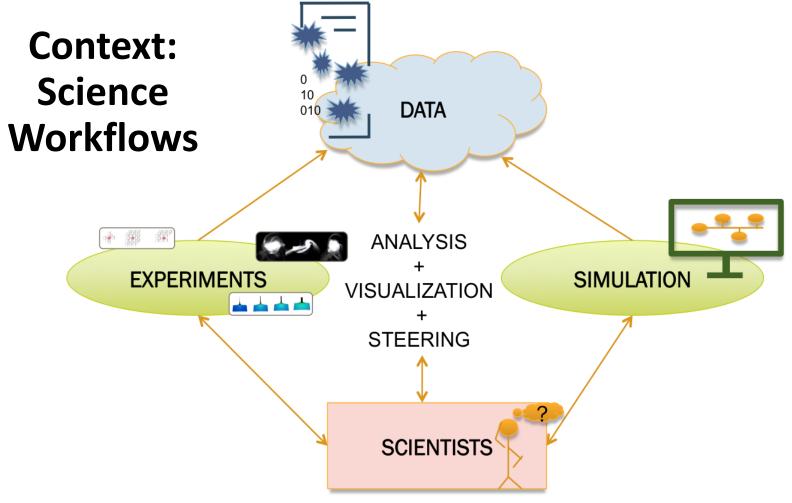








Summary of Breakout 1 on "Future synergies in programming systems for data-intensive and compute-intensive science" (contd)





## Summary of Breakout 2 on "Programming systems for data centric computing"

- Application examples
  - Smart Grid, Smart Cities, Smart Mobility, BNL nanotube optimization, ,agnetic fusion experimental data management/analysis, Compact Laser Accelerator such as BELLA, NNSA HED physics facility such as NIF, astrophysics simulation, ...
- Research opportunities include
  - Programming systems for data-centric applications
  - Schedulers/resource managers that address dynamic behavior of data/systems
  - Application portability across HPC/Cloud platforms
  - Constraint-based software stack: real-time, interactive,
  - Computational Steering (introspect and adapt): terminate experiment, change parameters, feedback
- ~ 15 participants



Summary of Breakout 3 on "Programming Systems Support for Post Moore's Law Computing"

- How can we exploit new technologies for science?
  - QC/QA, FPGA, Optical, Molecular computing, Neuromorphic and brain-inspired computing, Probabilistic and stochastic computing, new memory technologies, ...
- How do we incorporate new technologies into DOE's science processes?
- ~ 18 participants



### Summary of Breakout 4 on "Ensuring Correctness for Exascale and Beyond"

- Correctness issues: Inaccuracies
  - Inaccuracies from non-determinism ("non-reproducibility")
  - Inaccuracies and Instabilities from using too little FP precision
- Correctness issues: Inefficiencies
  - Inefficiencies from overly conservative data sharing (too many "barriers")
  - Inefficiencies from using high precision floating point everywhere
- Detection Approaches
  - Static analysis (automated, partial guarantees, false positives)
  - Dynamic analysis (automated, partial guarantees, false negatives)
  - Theorem proving (semi-automated, full correctness)
  - New algorithms
- Accuracy & Reproducibility Approaches
  - Static analysis for worst-case accuracy
  - Adapt computations to improve accuracy, e.g., Herbie
  - Minimize precision while guaranteeing good-enough accuracy, e.g. Precimonious

Maximize reproducibility while staying within worst-case accuracy boundaries, e.g., reproBLAS
 9/21/16
 X-Stack PI Meeting Update (V. Sarkar)
 30



#### Summary of Breakout 5 on "High Performance Languages"

- Risk Factors in adopting a New Language
  - − New syntax & semantics → new skills to be learned
  - Immature tool chain and developer ecosystem
  - ... yet new languages are adopted all the time in commercial/enterprise computing
- How to lower (real/perceived) barrier to entry for adopting new languages in HPC?
  - Hackathons to try out new languages on real-world problems
  - Funding for 3-month mini-projects (micro-interactions)
  - Embed CS graduate students within application teams
  - Embody programming model in library instead of language



### Outline

• Background on X-Stack Program

• X-Stack PI meeting, April 6-7, 2016

<u>Conclusions</u>



### Some Observations & Lessons Learned

- Computations and communications will be irregular due to heterogeneous processors characteristics, deep memory hierarchies, and much higher rate of faults than current platforms. Programmability and performance portability become increasingly important and challenging.
- With DSLs, application code size can be reduced by 100x, and the code generated and optimized has about 3x faster execution time.
- Unprecedented parallelism, asynchrony, and irregular computations and communications are well suited to task-oriented dataflow programming models.
- Continued advances in programming systems, runtime systems, and tools are critical for the Moore's Law "end game" (even beyond exascale)



- Jan 2010: Advanced Architectures and Critical Technologies for Exascale Computing (FOA and Lab announcement)
  - Program duration: FY10-FY12

Office of

- Renewal: FY13-FY15
- Jan 2010: X-Stack Software Research (FOA and Lab announcement)
  - Program duration: FY10-FY12
- Jan 2010: Scientific Data Management and Analysis at Extreme Scale (FOA and Lab announcement)
  - Program duration: FY10-FY12
- June 2010: Exascale Co-Design Centers (Lab announcement)
  - Program duration: FY11-FY16



# Computer Science Solicitations related to Extreme Scale Computing (contd)

- Nov 2011: X-Stack: Programming Challenges, Runtime Systems, and Tools (FOA and Lab announcement)
  - Program duration: FY12 FY14
  - Renewal: FY15
- Jan 2013: Exascale Operating and Runtime Systems (Lab announcement)
  - Program duration: FY13 FY15
- March 2014: Scientific Data Management, Analysis and Visualization at Extreme Scale 2 (FOA and Lab announcement)
  - Program duration: FY14 FY16



# Computer Science Solicitations related to Extreme Scale Computing (contd)

 July 2014: Resilience for Extreme Scale Supercomputing Systems (FOA and Lab announcement)

Program duration: FY14 - FY16

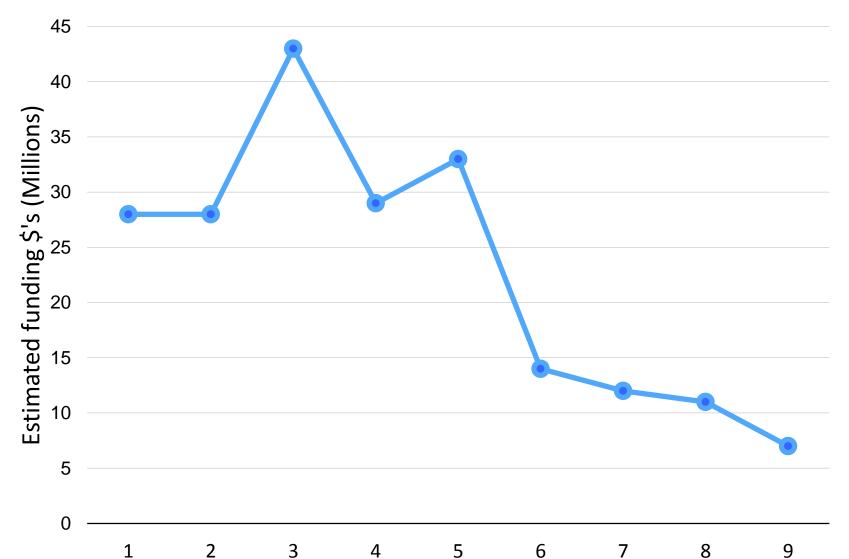
 May 2015: Storage Systems and Input/Output for Extreme Scale Science (FOA and Lab announcement, May 2015)

Program duration: FY15 – FY17

- April 2016: Machine Learning and Understanding for High Performance Computing Scientific Discovery (FOA and Lab announcement)
  - Program duration: FY16 FY18



# CS research programs related to Extreme Scale Computing (Estimates based on target funding \$'s in solicitations)



37



### Some concluding thoughts

- The 2016 X-Stack PI meeting demonstrated US leadership in cutting-edge software research on programming systems, runtime systems, and tools for current and future HPC systems
  - Given the current funding realities, X-Stack participants in academia have now begun moving to CS research opportunities outside of ASCR and DOE
  - Implications on recruiting & retention in national labs
- NSCI envisions a "coordinated research, development, and deployment strategy" for High-Performance Computing
  - "Executive Order -- Creating a National Strategic Computing Initiative", July 29, 2015
- How do we ensure the continued health of an HPC software research pipeline for exascale systems and beyond?