BIG GEASE from the Data, Devices and Interaction Laboratory

Thursday, October 3 2019 Michael E. Papia

Northern Illinois University

Lectures and discussions of current research and technical developments in computer science for beginning graduate research students. Topics will emphasize open problems and recent scientific advances. Content may vary to reflect research advances in areas such as data analytics, scientific computing, graphics and visualization.

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- Who has active research projects?
- What are NIU CS faculty interests?
- Where do I get more information?
- How do I get involved?

Bit About Me Education

- Northern Illinois University Physics (BS)
- University of Illinois @ Chicago Computer Science (MS)
- University of Chicago Computer Science (MS, PhD)
- University of Chicago Business School (SLLP)
- Harvard University Business School (GMP)
- Stanford University Hasso Plattner Institute of Design (Design) Thinking) ration Environments RD4: Scientist 1997 - 2008

RD5: Scientist

Deputy Associate Laborat



Bit About Me (Professional)

- Fermi National Accelerator Laboratory (Undergraduate/Graduate) Argonne National Laboratory
- Northern Illinois University

Scientific Visualization and Analysis 2000 - 2018

RD2: Assistant Scientist

RD3: Scientist

Collaboration Environments 1997 - 2008

RD4: Scientist

CSCI 600 - Big Ideas in Computer Science - Fall 2019

RD5: Scientist

Deputy Associate Laborat

2005

Bit About Me Research - Areas/Interests

- Advanced Display Environments
- Collaboration Technology
- High Performance Computing (Environments)
- Information Visualization in Visualization and Analysis
- Scientific Visualization and Analysis Augmented/Virtual Reality

Collaboration Environments 1997 - 2008

RD4: Scientist



RD5: Scientist

Deputy Associate Laborat

2005

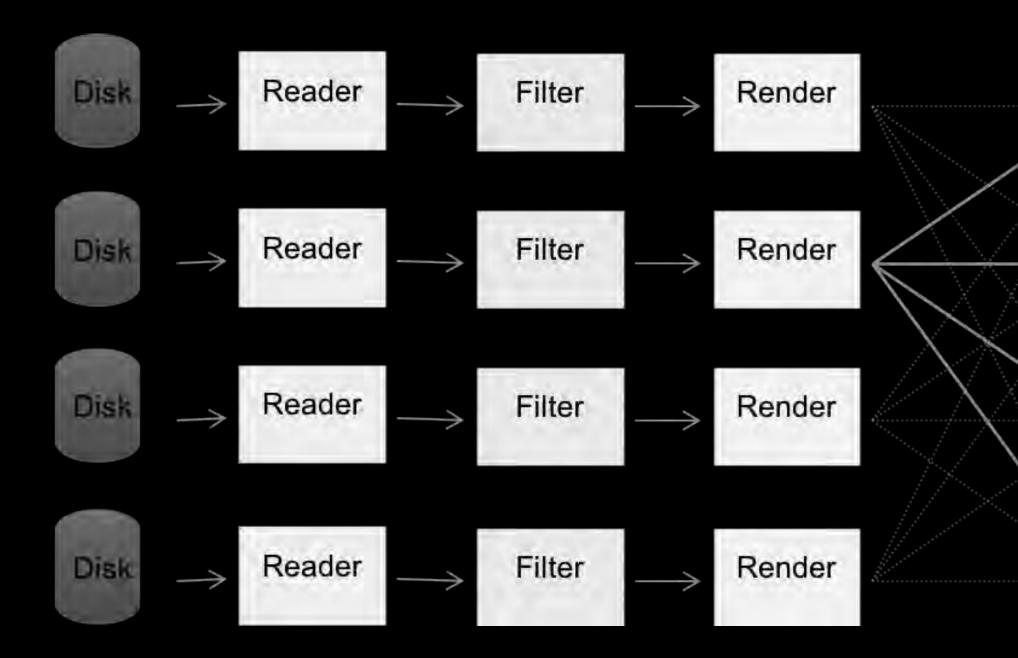
Bit About the ddiLab

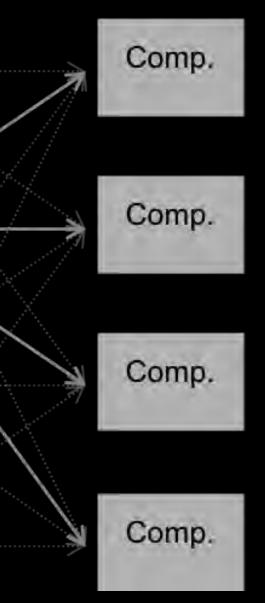
- Joint lab with School of Art and Design Time Arts (Professor Joseph) Insley)
- Emphasis on visualization and data analysis coupled to highperformance computing in the support of science
- Students
 - 1 PhD (Information Visualization)
 - 3 MS (HPC Log Analysis, Authentication Infrastructure and Machine Learning)
 - 3 Undergraduates (Virtual Reality and HPC Log Analysis)

Scientific Visualization and Analysis

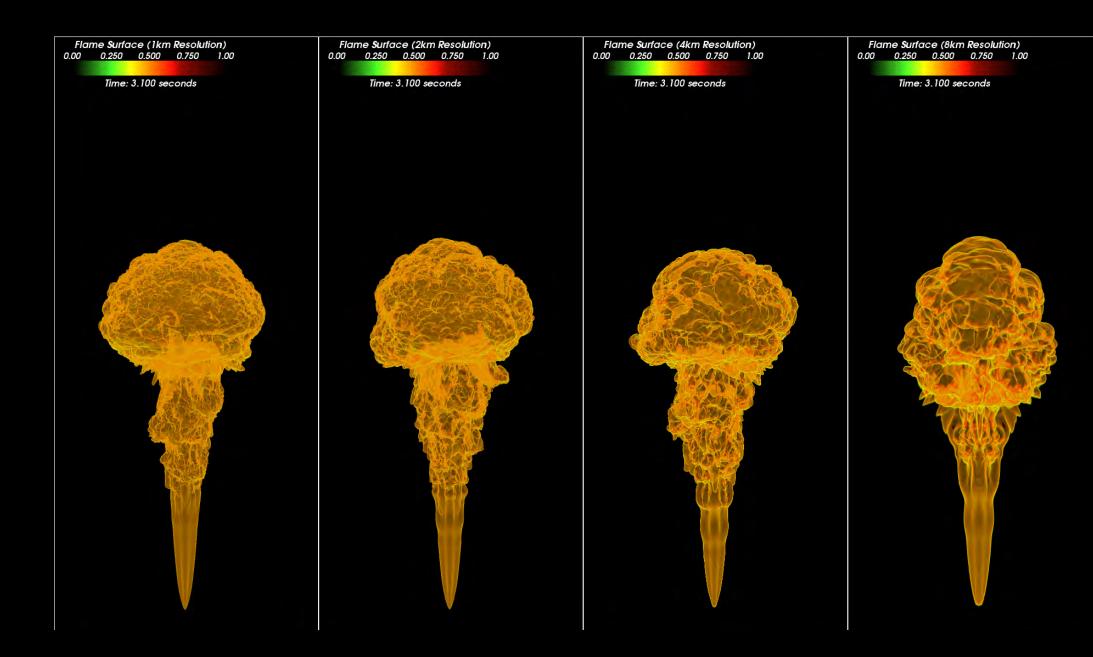
- vI3: volume rendering library
 - Parallel volume rendering library that exploits GPU hardware
 - Uses native data formats
- Integration with virtual and augmented reality
- Usability and collaboration
- Domain specific visualizations

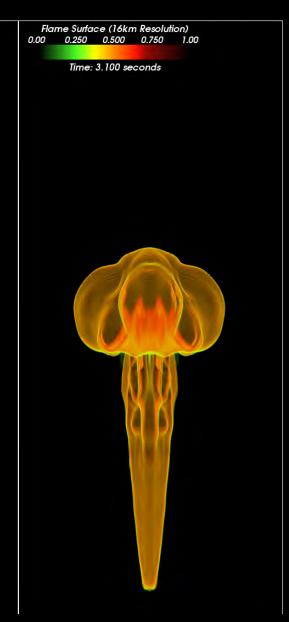
v13: Volume Rendering Library





Thermonuclear Flame Plume Rising in a Column





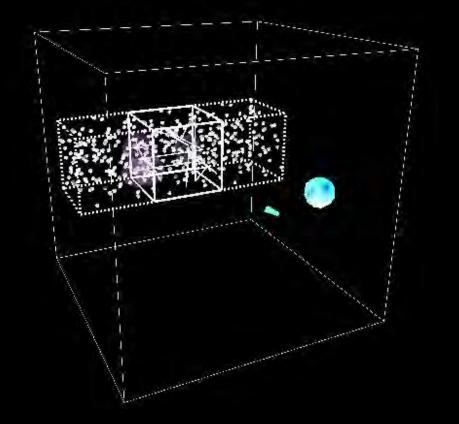
Local Lighting Improving the Quality of Visualizations^a

^a M. Shih, S. Rizzi, J. Insley, T. Uram, V. Vishwanath, M. Hereld, M. E. Papka, K. L. Ma, *Parallel Distributed, GPU-Accelerated, Advanced Lighting Calculations For Large-Scale Volume Visualization*, **2016 IEEE 6th Annual Symposium on Large Data Analysis and Visualization (LDAV)**, pp. 47-55, October 2016.]

13 CSCI 600 - Big Ideas in Computer Science - Fall 2019

Global Lighting

Virtual Reality^{bc}

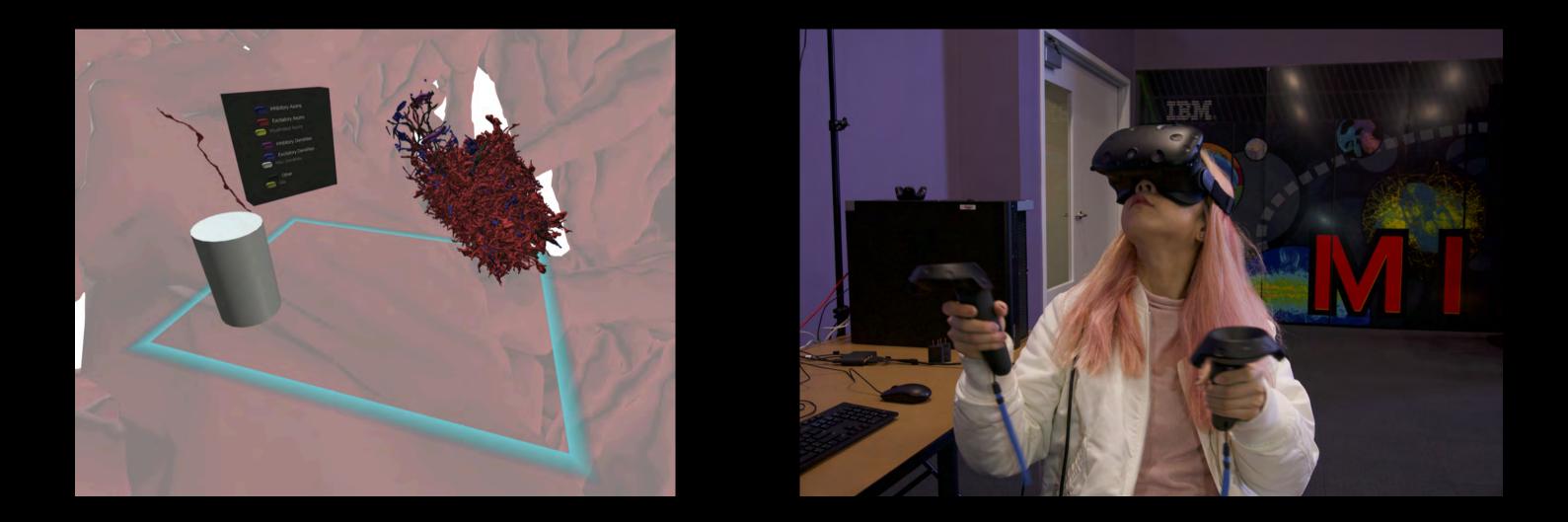




^b T. Disz, M. E. Papka, R. Stevens, M. Pellegrino, V. Taylor, *Virtual Reality Visualization of Parallel Molecular Dynamics Simulation*, **1995 Simulation** Multiconference Symposium, pp. 483-87, Phoenix, AZ, April 1995.

^cK. Reda, A. Knoll, K. Nomura, M. E. Papka, A. E. Johnson, J. Leigh, *Visualizing Large-Scale Atomistic Simulations in Ultra-resolution Immersive Environments*, Proceedings of the 2013 IEEE Symposium on Large Data Analysis and Visualization (LDAV 2013), pp. 59-66, Atlanta, GA, October 13-14, 2013.

Virtual Reality^d



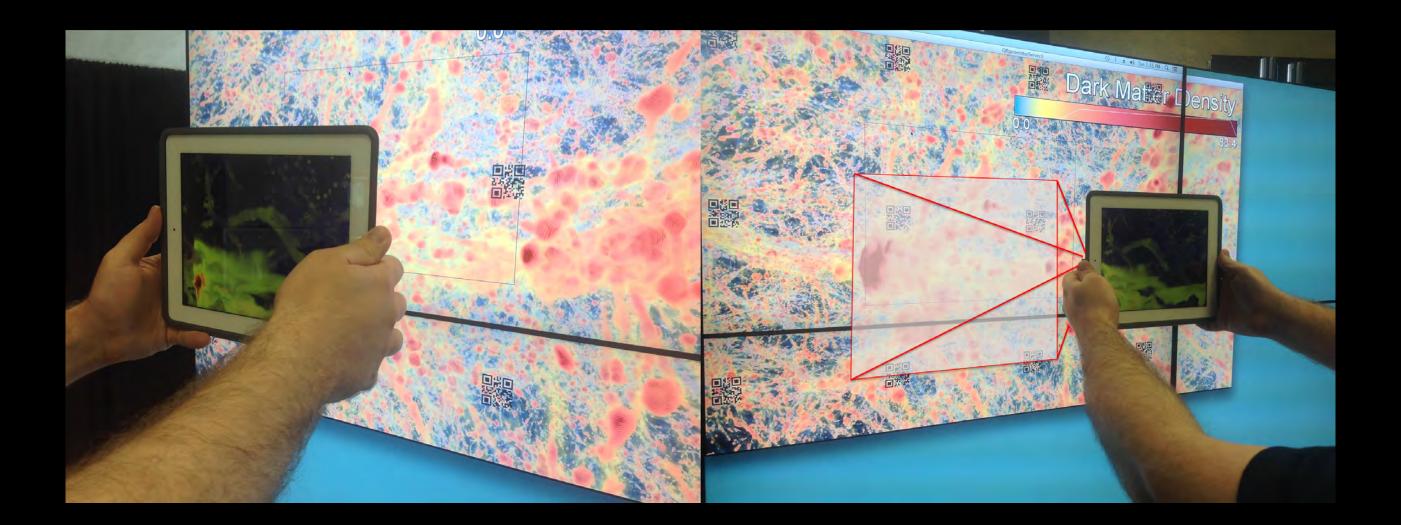
^d E. B. Brooks, J. A. Insley, M. E. Papka, S. Rizzi, *Virtual reality tools for the correction of automated volume segmentation errors using dense surface reconstructions*, **2017 IEEE 7th Symposium on Large Data Analysis and Visualization (LDAV)**, pp. 92-93, October 2, 2017. [POSTER]

Usability and Collaboration^e



^e K. Reda, A. E. Johnson, M. E. Papka, J. Leigh, Modeling and Evaluating User Behavior in Exploratory Visual Analysis, Information Visualization 15(4), pp. 325–339, October 2016.

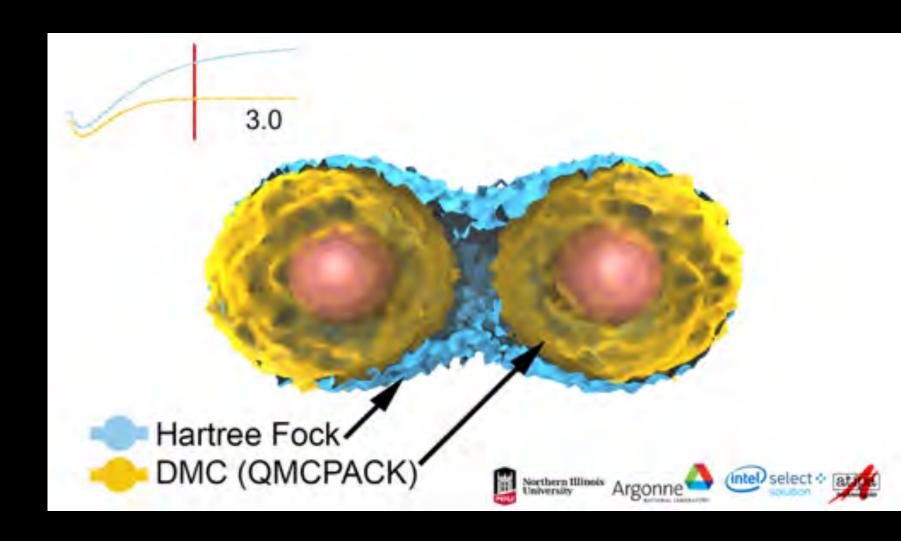
Usability and Collaboration^f



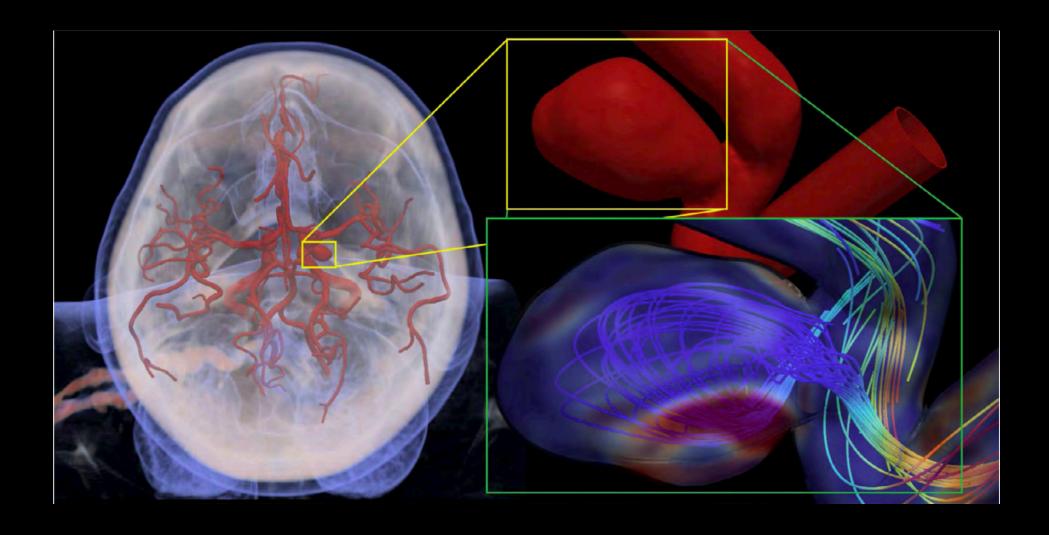
^f P. Lindner, A. Rodriguez, T. Uram, M. E. Papka, *Augmenting Views on Large Format Displays with Tablets*, Proceedings of the 2nd ACM Symposium on Spatial User Interaction (SUI 2014), Honolulu, HI, October 4-5, 2014. [Poster]

Domain Specific Visualizations

- Applied solutions to specific problems within domain
- Deep partnership with domain experts
- Current effort with NIU Chemistry
 - Visualizing and Quantifying Structural Ordering Underlying Static Structure Factor Peaks from Molecular Dynamics Simulations Travis Mackoy, Bharat Kale, Ralph Wheeler
 - Comparison Visualizations of Electron Density Approximation Methods Anouar Benali (ANL), Joe Insley, Ralph Wheeler

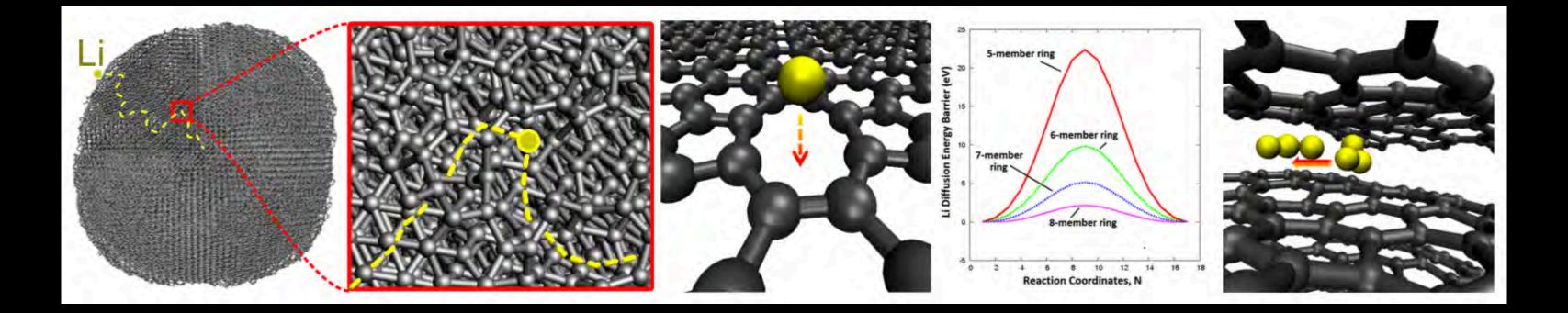


Domain Specific Visualizations^g



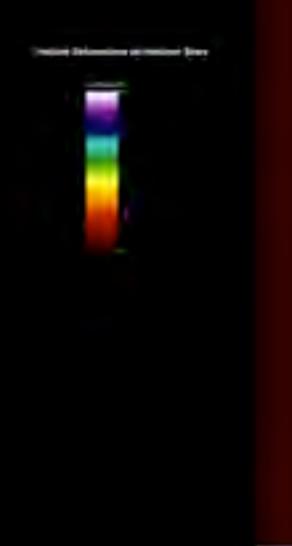
^g P. Perdikaris, J.A. Insley, L. Grinberg, Y. Yu, M. E. Papka, G. E. Karniadakis, *Visualizing Multiphysics, Fluid-Structure Interaction Phenomena in Intracranial Aneurysms*, Parallel Computing, 55, pp. 9-16, July 2016.

Domain Specific Visualizations^h



^hA. Gyulassy, A. Knoll, K. C. Lau, B. Wang, P.-T. Bremer, M. E. Papka, L. Curtiss, V. Pascucci, *Interstitial and Interlayer Ion Diffusion Geometry Extraction in Graphitic Nanosphere Battery Materials*, IEEE Transactions on Visualization and Computer Graphics, 22(1):916-925, January 2016.

Domain Specific Visualizations





Domain Specific Visualizations



High Performance Computing

 Applicationsⁱ Communication^j **Operations**^k

¹R. Fisher, L. Kadanoff, D. Lamb, A. Dubey, T. Plewa, A. Calder, F. Cattaneo, P. Constantin, I. Foster, M. E. Papka, S. I. Abarzhi, S. M. Asida, P. M. Rich, C. C. Glendenin, K. Antypas, D. J. Sheeler, L. B. Reid B. Gallagher, and S. G. Needham, *Terascale Turbulence Computation Using the FLASH3 Application Framework on the IBM Blue Gene/L System*, IBM Journal of Research and Development, 52(1.2):127-36, 2008.

V. Vishwanath, M. Hereld, V. Morozov, M. E. Papka, Topology-Aware Data Movement and Staging for I/O Acceleration on Blue Gene/P Supercomputing Systems, SC'11 Proceedings of 2011 International Conference for High Performance Computing, Networking, Storage and Analysis, Article No. 19, Seattle, WA, November 2011.

^kS. Read, M. E. Papka, Operational Metrics Reporting Processes at Scientific User Facilities: Comparing A High-Energy X-Ray Synchrotron Facility to a Supercomputing Facility}, 2017 IEEE International Professional Communication Conference (ProComm), pp. 1-6, Madison, WI, July 23, 2017.

High Performance Computing

Power¹ Scheduling^m Workflows/Workloads^{n, o}

S. Wallace, Z. Zhou, V. Vishwanath, S. Coghlan, J. Tramm, Z. Lan, M. E. Papka, Application Power Profiling on IBM Blue Gene/Q, Parallel Computing, 57, pp. 73-86, September 2016.

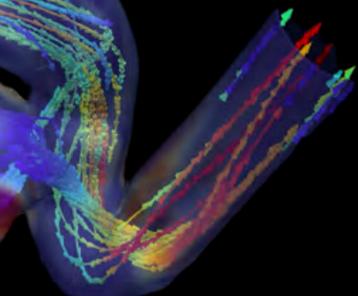
"Y. Fan, Z. Lan, P. Rich, W. E. Allcock, M. E. Papka, B. Austin, D. Paul, Scheduling Beyond CPUs for HPC, Proceedings of the 28th International Symposium on High-Performance Parallel and Distributed Computing, pp. 97-108, June 2019. W. E. Allcock, B. S. Allen, R. Ananthakrishnan, B. Blaiszik, K. Chard, R. Chard, I. Foster, L. Lacinski, M. E. Papka, R. Wagner, Petrel: A Programmatically Accessible Research Data Service, Proceedings of the Practice and Experience in Advanced Research Computing on Rise of the Machines, pp. 49, July 2019. ^o M. A. Salim, T. D. Uram, J. T. Childers, P. Balaprakash, V. Vishwanath, M. E. Papka, *Balsam: Automated Scheduling and Execution of Dynamic, Data-Intensive HPC* Workflows, arXiv preprint arXiv:1909.08704, September 2019.



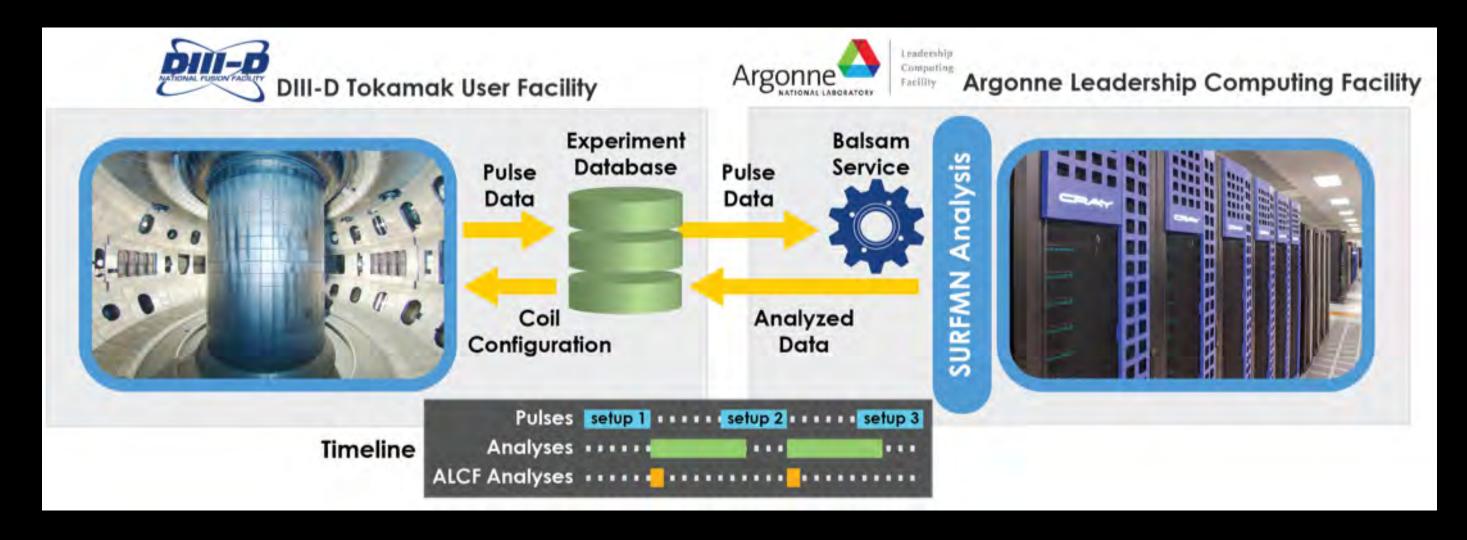
Traditional^p

R00 R01	R02 R03	Running Jobs	Queued Jobs	Reservatio	ns						
		Total Running	Jobs: 9								
		Job Id 🗘	Project	\$	Run Time 🔻	Walltime \$	Location	Queue	♦ Nodes ♦	Mode	\$
MO		1692764	wall_turb_dd		00:48:50	01:00:00	CET-02400-13731-128	default	128	c32	
		1692771	radix-io		00:37:32	01:00:00	CET-20440-31771-128	default	4	script	
	A REAL PROPERTY AND INC.	1692745	MoltenSalt		00:26:59	01:00:00	CET-40000-73371-1024	default	1024	c32	
			TRAssembly		00:22:29		CET-00040-33371-512	default		script	
		1682776	TRAssemble		00.21:33		CET-00000-33331-512	default		script	
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		1692784	CSC249A		And a state of the	and the second		default	128	c32	
										1	

^PL. Grinberg, J. A. Insley, D. Fedosov, V. A. Morozov, M. E. Papka, G. E. Karniadakis, *Tightly Coupled Atomistic-Continuum Simulations of Brain Blood Flow on* Petaflop Supercomputers, Computing in Science and Engineering, 14(6):58-67, 2012.]



Evolving (scheduling constraints)⁹

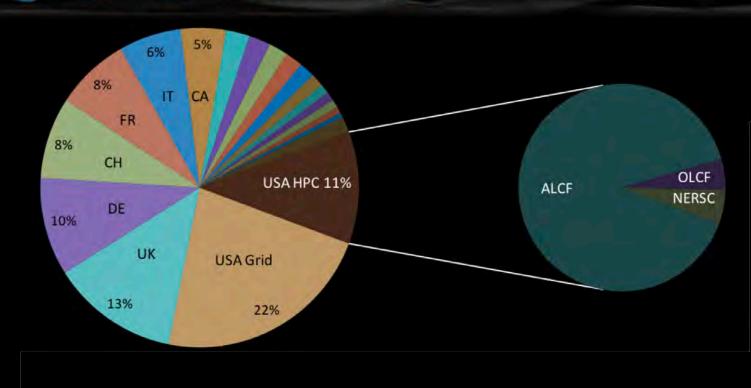


⁹ M. Kostuk, T. D. Uram, T. Evans, D. M. Orlov, M. E. Papka, D. Schissel, Automatic Between-Pulse Analysis of DIII-D Experimental Data Performed Remotely on a Supercomputer at Argonne Leadership Computing Facility, Fusion Science and Technology, September 2017.]

Evolving (complex workflows)'

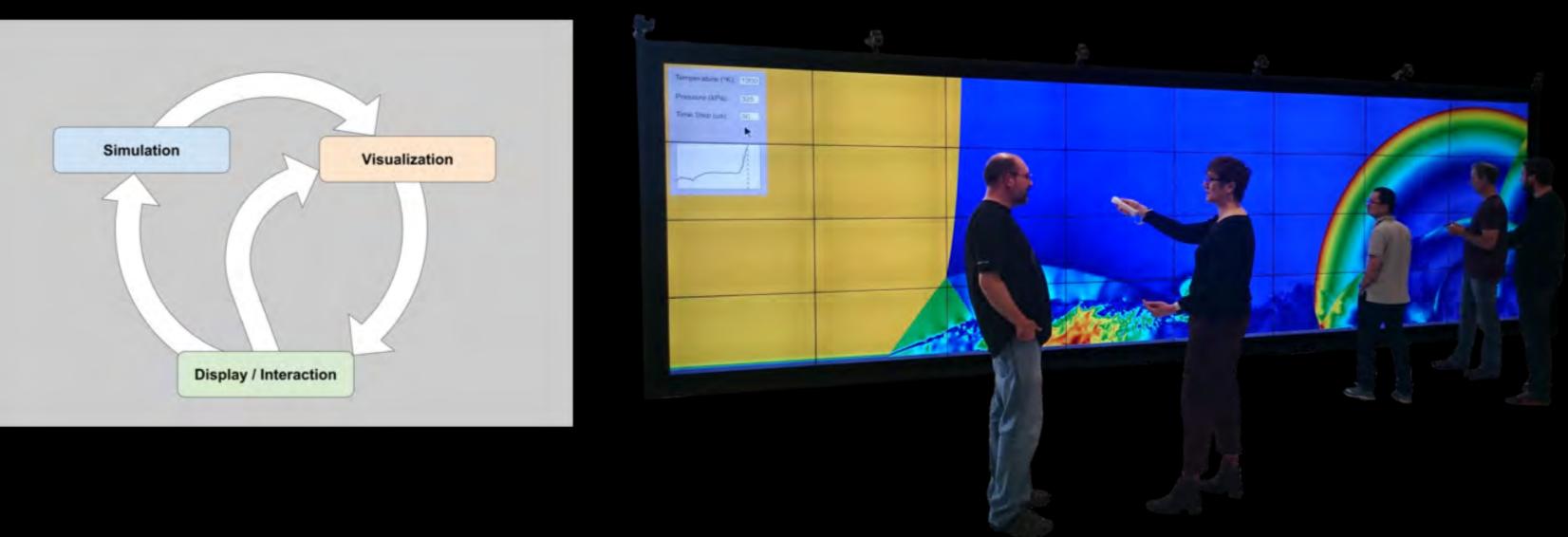
50% of the ATLAS papers based on 2015 data use the HPC-produced computing in a demonstrable manner

 These would still eventually be written without the US HPC effort, but they probably would not exist today: the time-to-science has been dramatically shortened.



^r T. LeCompte(HEP){06/02/2016} and J. T. Childers, T. D. Uram, D. Benjamin, T. J. LeCompte, M. E. Papka, An Edge Service for Managing HPC Workflows, Proceedings of the Fourth International Workshop on HPC User Support Tools (HUST'17), Denver, CO, November 12, 2017.]

Evolving (increased engagement)^s



^sT. Marrinan, A. Nishimoto, J. A. Insley, S. Rizzi, A. Johnson, M. E. Papka, *Interactive Multi-Modal Display Spaces for Visual Analysis*, **Proceedings of the 2016 ACM** on Interactive Surfaces and Spaces, pp. 421-426, Niagara Falls, Canada, November 6, 2016.]

HPC Environments

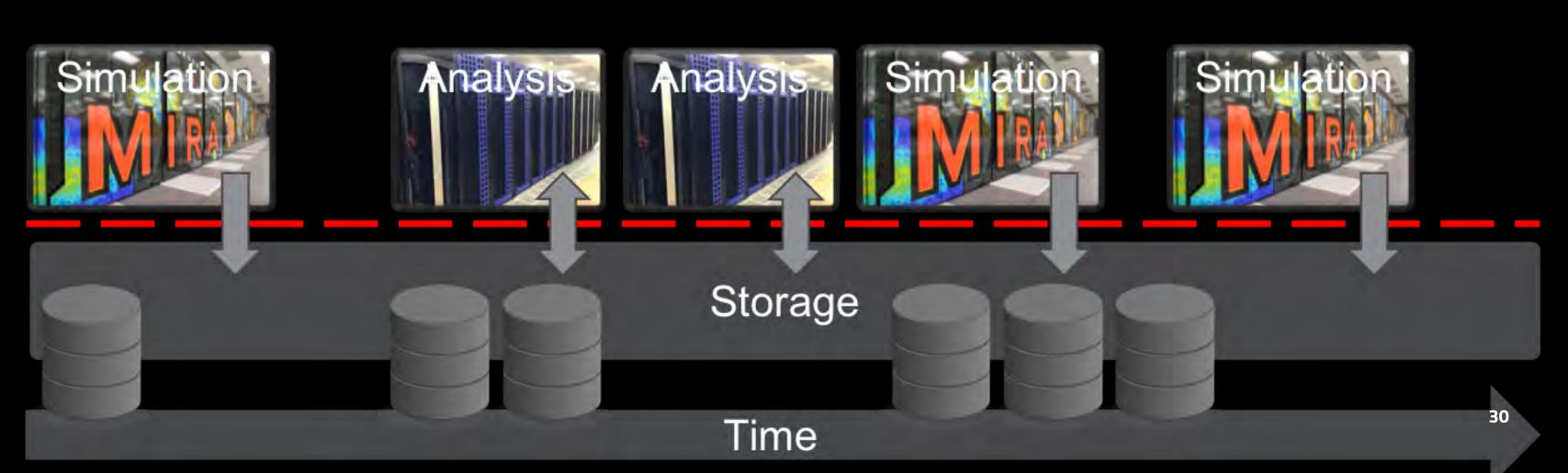
How do we enable scientists (users) to be the most productive from start to finish?

- How do we improve usability?

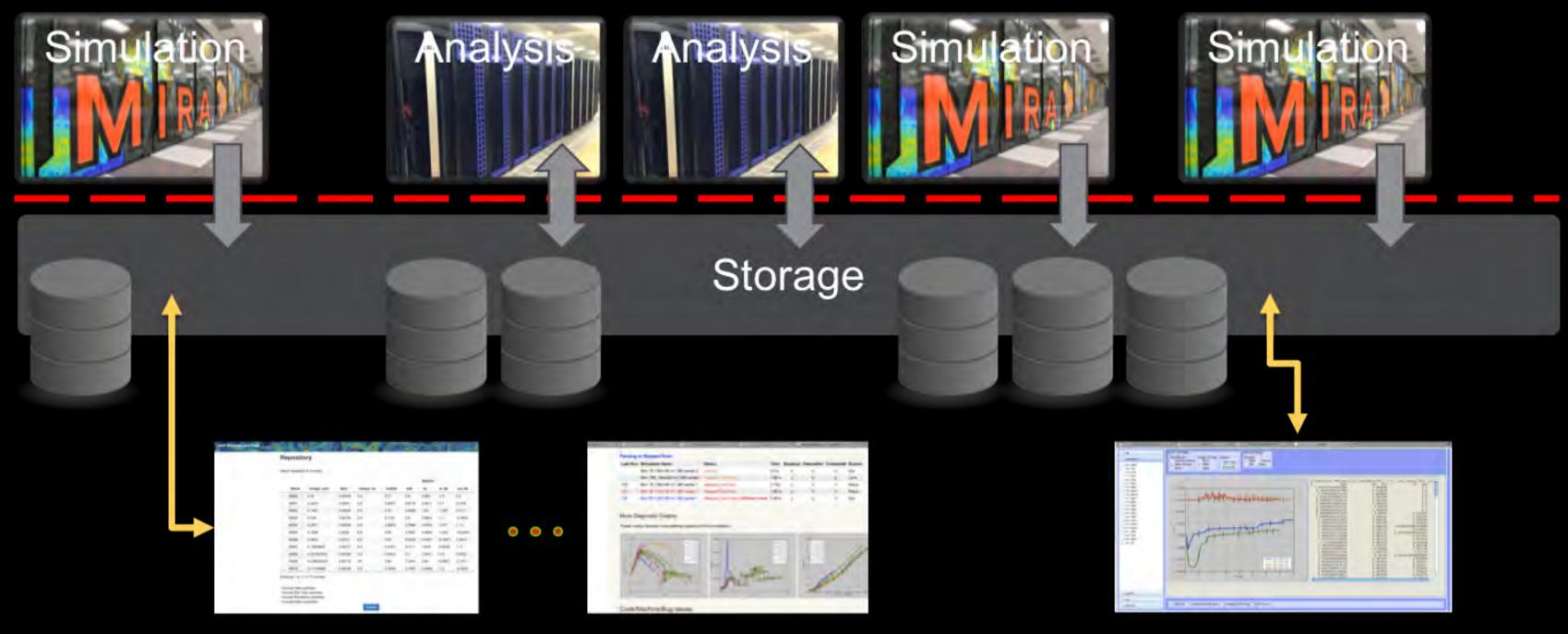
- How do we enable users of all levels?

- How do *simplify* supercomputing?

Workflow of Today

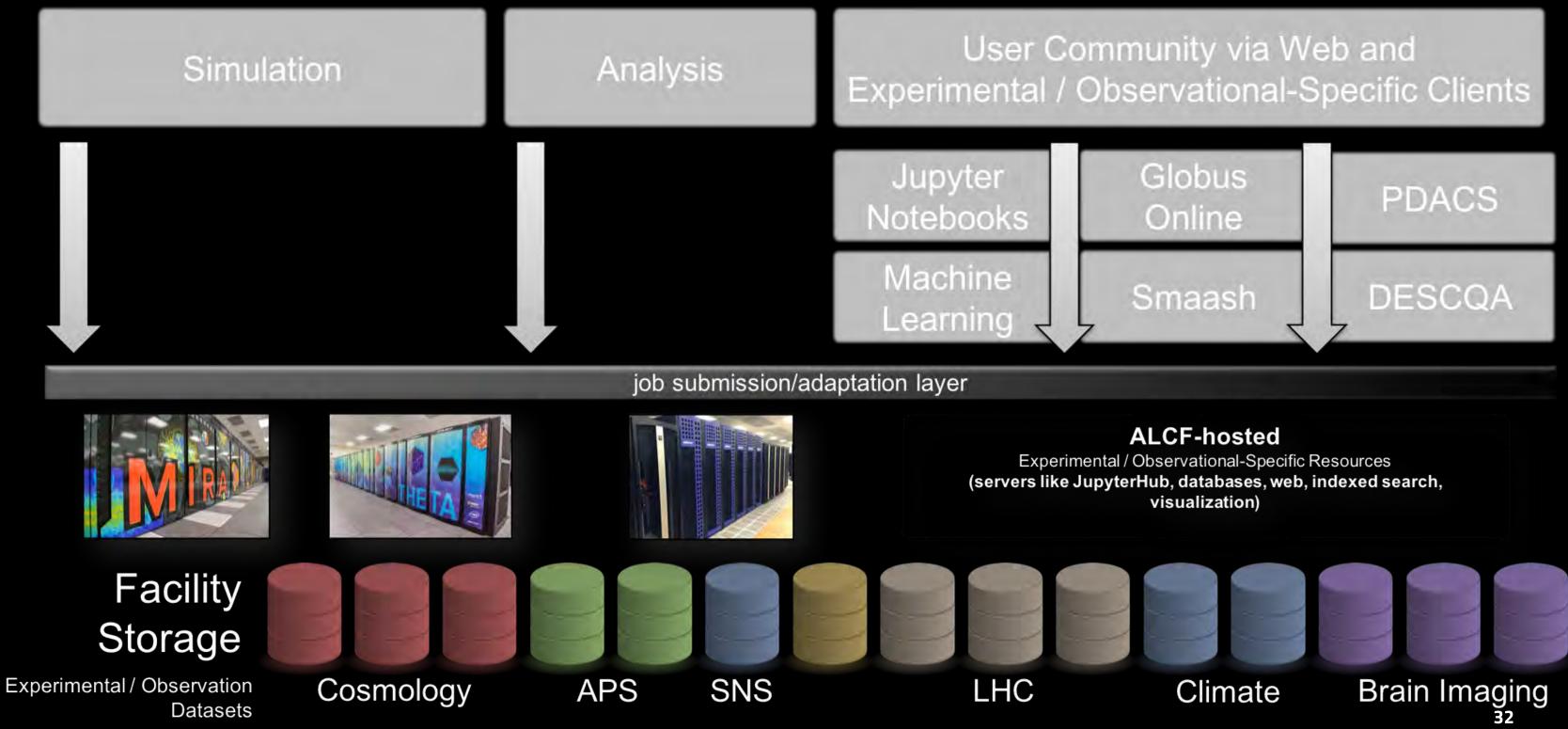


Workflow of Tomorrow (Today)



Time

Facility of Tomorrow



Observations (Science Management)

Data-intensive science (simulations and experiments) requires capture, curation and analysis

Data comes from many sources, in many formats and multiple sizes

Observations (Science Management)

- Problem with science management:
 - Tracking simulations and output [difficult]
 - Finding and reproducing old simulations: [difficult]
 - Monitoring live simulations: [inconvenient, idiosyncratic]
 - Post-processing, analysis and archival of results: [haphazard]
 - Assessing simulation behavior/performance: [difficult]

cult] osyncratic] lts: [haphazard] difficult]

Increased Access to Scientific Communities

Support for Application Teams

Simulation management and analysis system for Flash (Smaash)^t

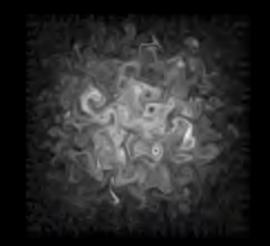
- Tracking and coordination of data (simulation and meta)
- Run-time monitoring of simulations and automated analysis of simulation output
- Method for managing / executing common workflows

^tR. Hudson, J. Norris, L. B. Reid, K. Weide, G. C. Jordan, and M. E. Papka, *Experiences Using Smaash to Manage Data-Intensive Simulations*, Proceedings of the 20th International Symposium on High-Performance Parallel and Distributed Computing, pp. 205-15, San Jose, CA, June 2011.

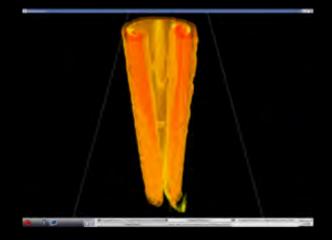


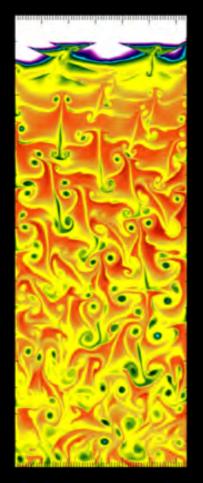
Prototype Partner – Flash

- Multi-physics
- Adaptive-mesh

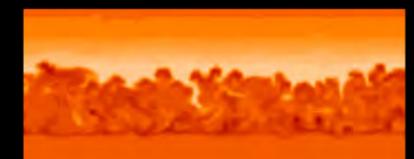


Compressible turbulence

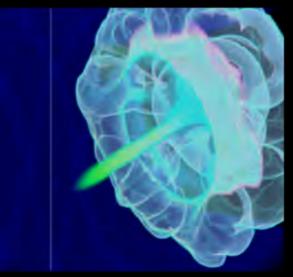




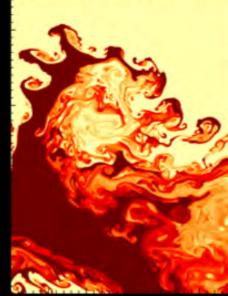
Cellular detonations



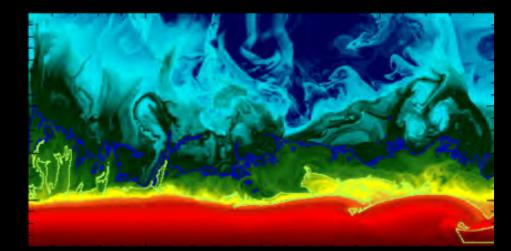
Nova outbursts on white dwarfs



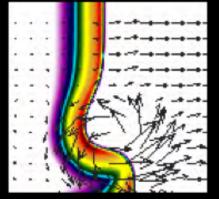
White



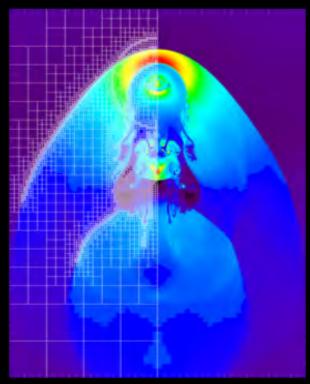
Rayleigh-Taylor instability



Helium burning or



ilame-vortex interactions



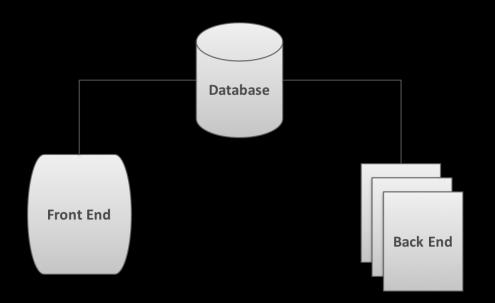
neutron stars

Prototype Partner - Flash

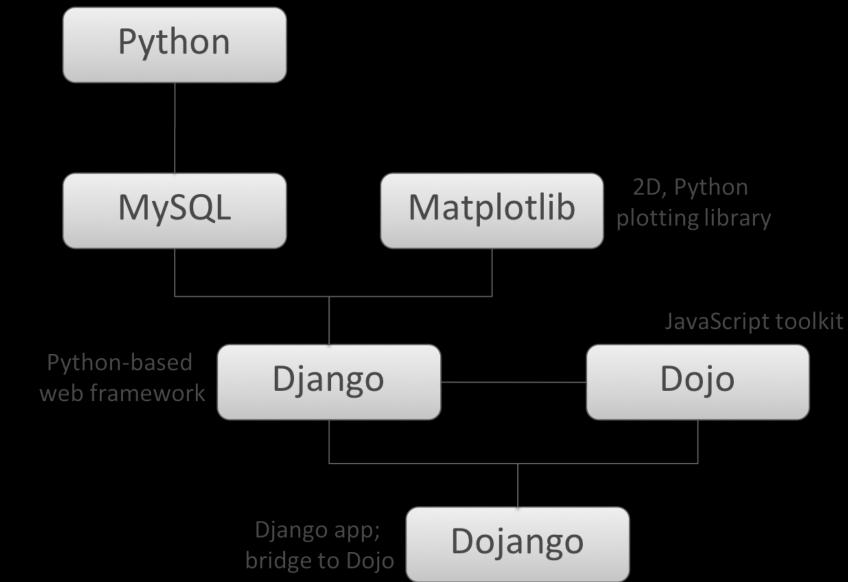
- Meta-data output
 - log: simulation progress, warnings, errors, resource use
 - .dat: integrated grid quantities
- Scientific data output (HDF5)
 - Checkpoint: complete information needed to restart simulation
 - Plotfile: data values of interest for analysis
 - Particle files: tracer particles of interest during analysis

Smaash Components

- Database (manages meta-data)
- Back end services (co-located with compute resources and scientific data)
- Front end interfaces (user facing)



Smaash Implementation



Smaash Back End Services

- Collector captures and stores meta-data in database about simulation
- Archiver automates the archiving of data
- Verifier cross checks output and database entries
- Associator connects a current simulation with campaign
- Observer responsible for updates to user (email)
- Visualizer automatic running of user specified visualization scripts

Smaash Front End Interfaces Views

- Tree collection of campaigns, simulations and runs
- Graph quick graphs of results
- Monitor automated visualizations
- Summary details and notes

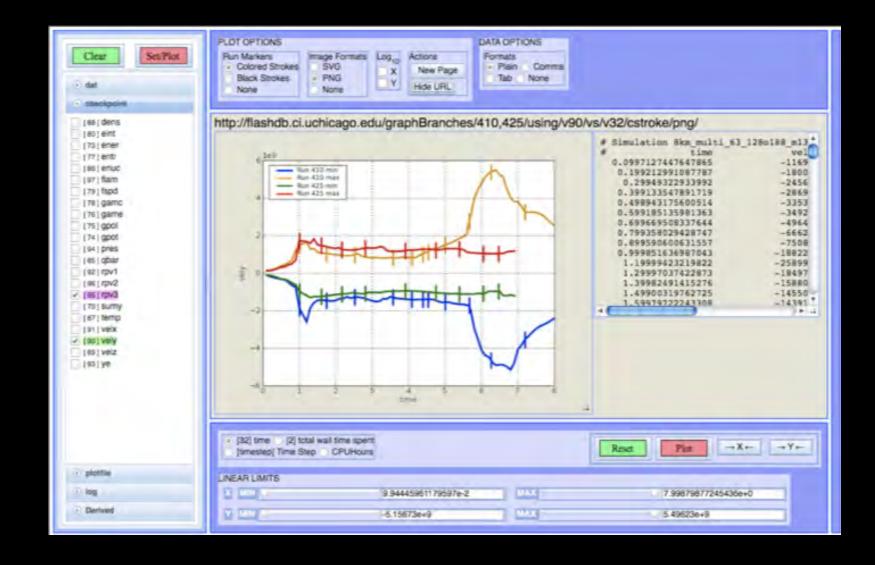


Tree View

Filter by Date	Filter by Tag	9	Filter by Site	Filter b	y Owner	
Before: 2/24/2011 After: 5/1/2010	Flame Spee FlameBubbl RTFlame ResolutionS WD_def	e 🚺	ellipse.uchicago.edu franklin.nersc.gov intrepid.alcf.anl.gov	Carlo C Chad C Chris D Dean T	l Jordan rlo Graziani ad Glendenin ris Daley an Townsley	
Show Hidden		Any		Eva Wu	yts	
Name	Date	Tags	Description		Dim	
FlameSpeed [55]	2010-11-	16	/intrepid-fs0/users/jn	orris/pe	1	
flameBubble [54]	2010-06-	12	/intrepid-fs0/users/h	udson/per 👩		
1km_sl85_g3E9_r32[1	04] 2010-06-	15 FlameBul	oble Flame bubble resolu	ition study, 🕤	16x16x1	
vrundir 0001 [683]	2010-06-	15 FlameBul	oble /intrepid-fs0/users/jn	orris/pe	16x16x1	
vrundir_0002 [685]	2010-06-	13 FlameBul	oble /intrepid-fs0/users/jn	orris/pe	16x16x1	
	2010-06-	20 FlameBul	ble /intrepid-fs0/users/jn	orris/pe	16x16x1	
> rundir_0004 [6	89] 2010-06-	22 FlameBul	oble /intrepid-fs0/users/jn	orris/pe	16x16x1	
2km_si85_g3E9_r32 [1	01] 2010-06-	12 FlameBul	ble /intrepid-fs0/users/h	udson/per 👔	16x16x1	
4km sl85 g3E9 r32 [1	2010-06-	12 FlameBul	ble flame bubble simula	tion at _4 🐧	16x16x1	
8km si85 g3E9 r32 [1	03] 2010-06-	12 FlameBul	ble Flame bubble resolu	tion study 🕤	16x16x1	
) 16km sl85 g3E9 r32 [100] 2010-06-	12 FlameBul	ble /intrepid-fs0/users/h	udson/per 🕤	16x16x1	

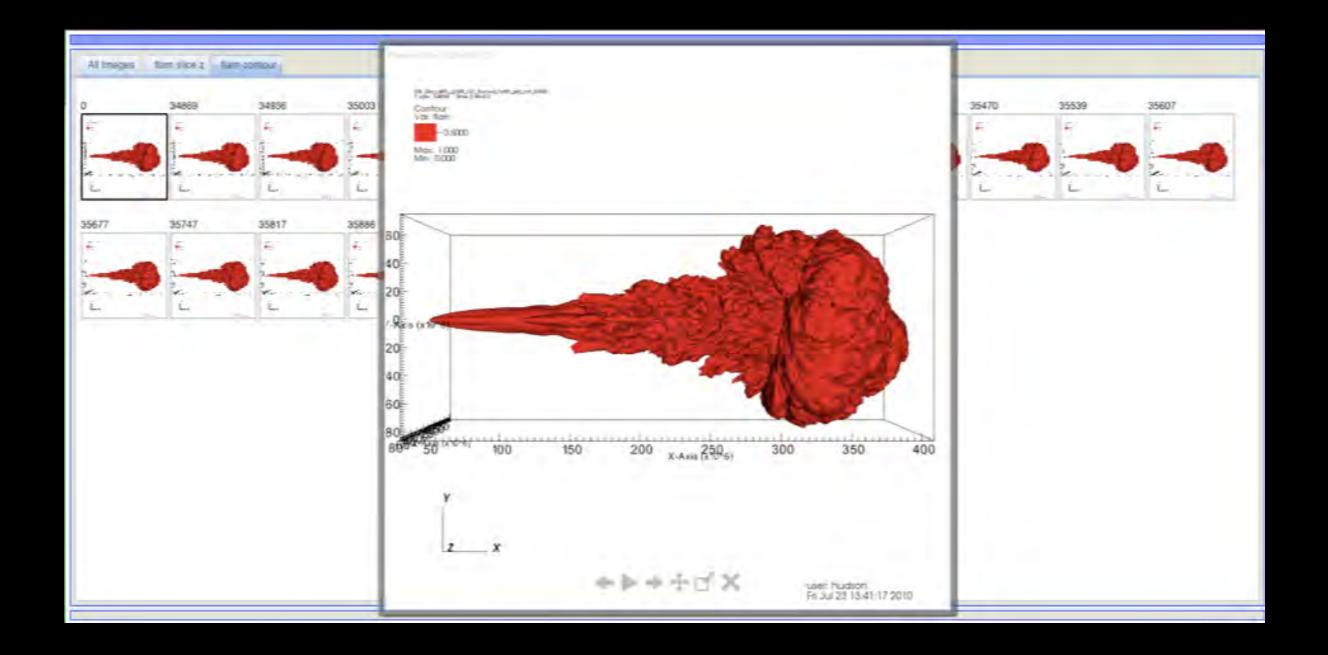


Graph View



http://flashdb.ci.uchicago.edu/graphBranches/410,425/using/v90/vs/v32/cstroke/png

Monitor View

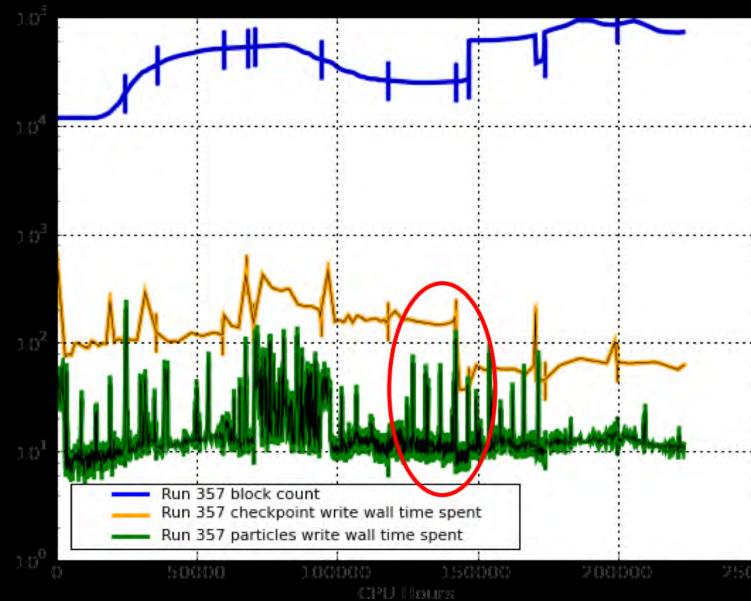


Summary View

FlameBubble	problem on 2048 processors
Run completed	
Parent: <u>rundir 0001 [683]</u> Details Files Ima	ges 🛃
/intrepid-fs0/	/users/jnorris/persistent/2010/ResolutionStudy/1
System Info	Linux login5 2.6.16.60-0.42.8-ppc64 #1 SMP Tue Dec 15 17:28:00 UTC 2
Setup Syntax	/intrepid-fs0/users/gjordan/persistent/2010/flameBubble/src/20100610/tru -maxblocks=40
	mpif90.lbm -g -O4 -qintsize=4 -qrealsize=8 -qfixed -qnosave -c -qsuffix=c -qsuffix=f=F90:cpp=F90 -qfree=f90 -WF,-DMAXBLOCKS=40 -WF,-DNXB
C Compiler Flags	mpicc.ibm -l/include -l/soft/apps/hdf5-1.6.6/include -DNOUNDERSCORE -qarch=450 -qtune=auto -qcache=auto -qmaxmem=16384 -D_FILE_OFF -DN_DIM=3 -DHAVE_MALLINFO
Max Number of Blocks/Proc	40
Max Number of Particles/Proc	1000



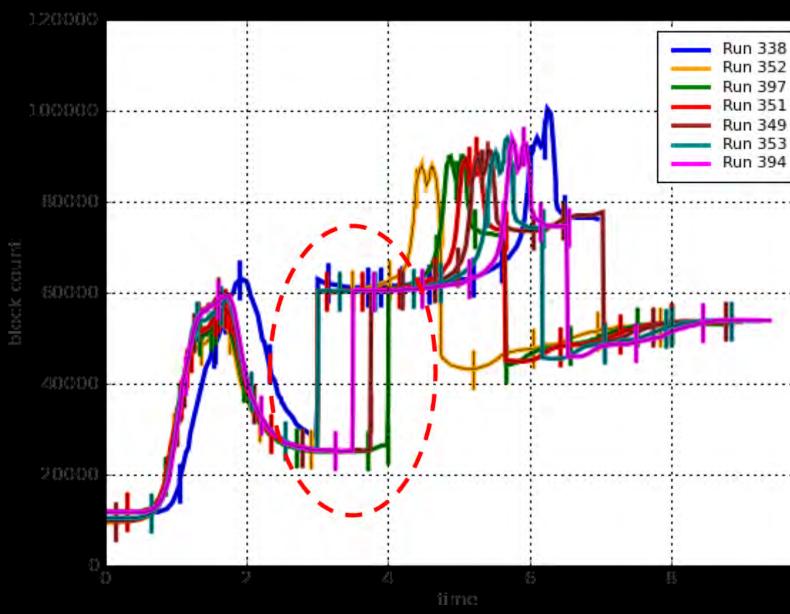
Smaash Outcomes (Simulation State)

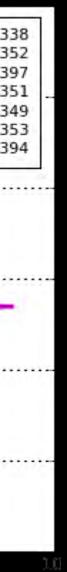




250000

Smaash Outcomes (Analysis)



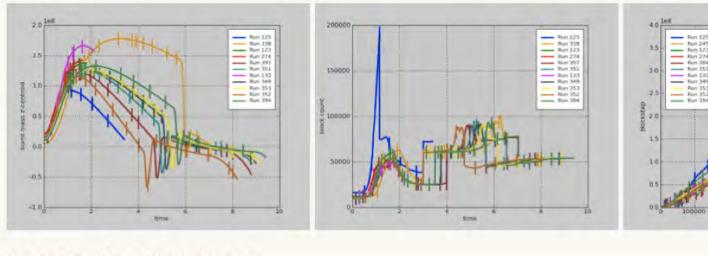


Smaash Outcome (Notebook)

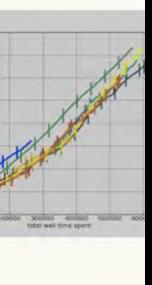
nulation Tree	0	Graph 🙁 📄 Flash S	Simulation Tree 🛛 🗋 Graph	h	8 🖬	MultipleBubbles -	< FlashDB < Cl	0 +
	Pending	or Stopped Runs						
	Last Run	Simulation Name	Status	Time	Breakout	Detonation	Completed	Runner
	-	8km 79 138o148 m1.365 series 2	pending	0.0 s	n	n	n	Cal
		8km 188_184o220 m1.365 series 1	stopped, low Enuc	1.65 s	У	n	у	Lynn
	133	8km 79 138o148 m1.365 series 1	stopped, low Enuc	2.15s	У	n	n	Klaus
	123	8km 56 123o148 m1.365 series 1	stopped, low Enuc	1.80 s	У	n	n	Klaus
	125	8km 63 128o148 m1.385 series 1	Stopped, Lynn rerun, different mass	5.40 s	у	У	n	Cal

More Diagnostic Graphs

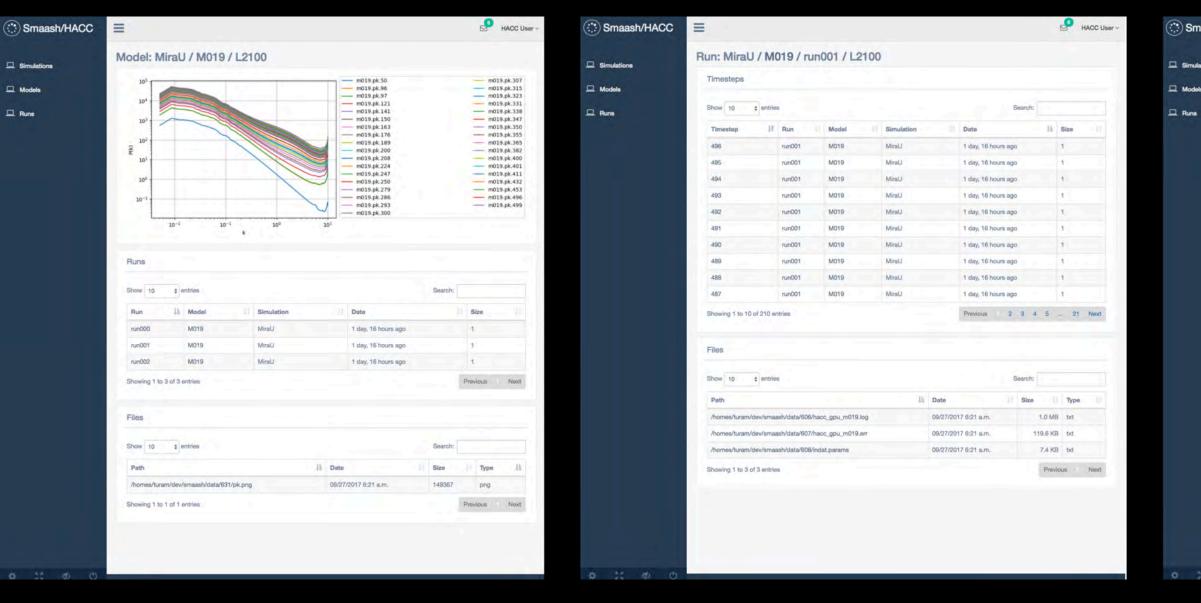
These mostly illustrate computational aspects of the simulations:



Code/Machine/Bug Issues



Smaash Today



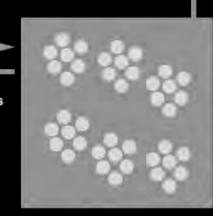
	Bun: MiraU / M019 / run000 / L2100		
6. 18	Run: Mirao / Mo19 / runo00 / L2100		
	Viewing /homes/turam/dev/smaash/data/589/indat.params	×	
		1	
	######################################		
	HACC_HEADER_VERSION 1.0.0		
			Size
	######################################		1
	# Length scales are measured in Mpc/h		
	# OMEGA_CDM and OMEGA_NU given for Omega_cdm and Omega_nu (no \$h^2\$)		1
	# DEUT=Omegab+h^2		4
	<pre># HUBBLE: Hubble constant/100 km/s/Mpc # SS8: target value for sigma_8</pre>		1
	# SS6: target value for sigma_8 # NS: index of the primordial power spectrum		1
	# W_DE: constant dark energy equation of state		
	# Currently flat Universe only		1
			1
	OMEGA_CDM 0.145084 DEUT 0.02217382692		
	OMEGA_NU 0.00686393	1.1	1
	HUBBLE 0.825136069		1
	SS8 0.854654384 NS 1.026482126		
	W DE -0.981272302		1
	WA_DE -0.339335368548398		1
	T_CMB 2.726		
	N_EFF_MASSLESS 0.0 N_EFF_MASSIVE 3.04		29 Next
	N_EFF_MASSIVE 3,04		

	# Initializer Set-up and read-ins		
	<pre># ZIN: Starting redshift # USE_WHITE_NOISE_INIT: YES: real space, NO: k space</pre>		
	<pre># input type: INIT[RECORD BLOCK COSMO]RESTART</pre>		
1 N 18	# INIT: generates internal initial conditions, rest if for read-ins		
	<pre># distrib. type: ROUND_ROBIN ALL_TO_ALL ONE_TO_ONE restart_step</pre>		
	<pre># (ignored if INPUT_TYPE is INIT) # ROUND_ROBIN indicates particles must be looked at by all processors</pre>		Type
	# ONE_TO_ONE indicates that particles physically reside on matching processor		46-
	# ALL_TO_ALL improved ROUND_ROBIN		txt
4	# For restart: specify time step and modify INPUT_BASE_NAME		bd
	<pre># TRANS: Transfer function: Read in CAMB file (specify name in INPUT_BASE_NAME) # or internal TF (KH, HS, PD, BBKS)</pre>		545.
	* 01 11(E110(11 (M, 15, FD, DOS)		txt
	Z_IN 200.0		
	USE_WHITE_NOISE_INIT YES		ous Next
	TRANS CMB		
	INPUT_BASE_NAME cmbM019.tf INPUT_TYPE INIT		
	DISTRIBUTE_TYPE LAST		
	MAX_MINUTES 700		

New Efforts in Science

Today Yesterday APS APS Discipline Key Natana Salara Intodest & Urst See Sal Science Environmental Sol Demisity Phyme I Falgemen 44.00 Disciplina Key Materialis Erema Naturalis Erema Geo Sail Science Ereisementelis Sci Chernaty Physics Folgemes CPU 12444 CPU (Dill or #00 1.8-8.8 4.85 CPU 12.8 mil -1000 2.16 Turnaround time depends **Beamline PC** DTN on availability of ALCF Compute Turnaround time depends **Beamline PC** DTN APS on availability of APS Compute Compute - Job monitoring 4000 cores - Results view - Workflow extension

ALCF Theta (11.7 PetaFLOPs)

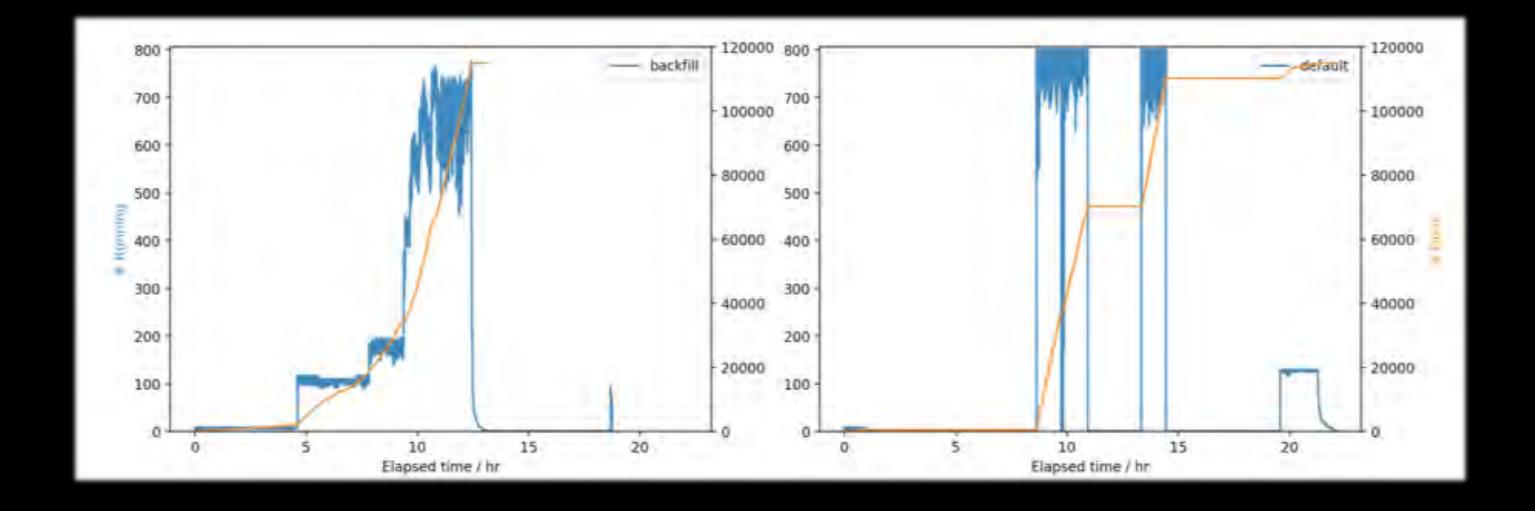


Balsam

Balsam establishes a deep job reservoir, and flows jobs to ALCF machines based on availability

- Individual APS application runs to individual ALCF jobs
- Many small APS jobs flow into a single large/long ALCF job
- Balsam provisions new jobs as needed to satisfy workload
- Balsam leverages backfill where possible; otherwise, optimizes jobs for scheduler

New Efforts in Science^u



^u M. A. Salim, T. D. Uram, J. T. Childers, P. Balaprakash, V. Vishwanath and M. E. Papka, *Balsam: Automated Scheduling and Execution of Dynamic, Data-Intensive* HPC Workflows, to appear **1st Annual Workshop on Large-scale Experiment-in-the-Loop Computing**, Denver, CO, November 2019.

Information Visualization

Connection to X science

December

January

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If I have seen further it is by standing on the shoulders of giants. – Sir Isaac Newton

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HPC Landscape Vesterday

Simulation Applications
64bit floating point
memory bandwith
random access to memory
sparse matrices
distributed memory jobs
synchronous input/output multinode
scalability limited communication
low latency high bandwidth
large coherency domains (sometimes)
output typically greater than input
output rarely read
output is data



HPC Land Scape (Today)

Simulation Applications	Big Data Applications	Deep Learning Applications
64bit floating point	64bit and integer important	lower precision <= 32bit
memory bandwith	data analysis pipelines	inferencing can be 8bit (TPU)
random access to memory	databases including NoSQL	scaled integer possible
sparse matrices	MapReduce/SPARK	training dominates development
distributed memory jobs	millions of jobs	inference dominates pro
synchronous input/output multinode	input/output bandwidth limited	reuse of training data
scalability limited communication	data management limited	data pipelines needed
low latency high bandwidth	many task parallelism	dense float point typical SGEMM small DFT, CNN
large coherency domains (sometimes)	large-data in and large-data out	ensembles and search
output typically greater than input	input and output both important	single models small
output rarely read	output is read and used	input more important than output
output is data	output is data	output is models