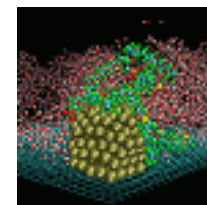
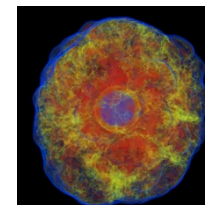
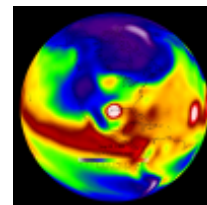
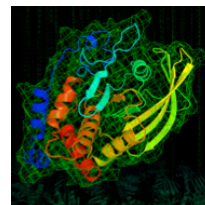
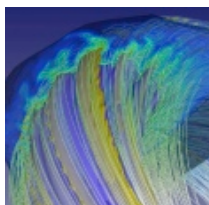
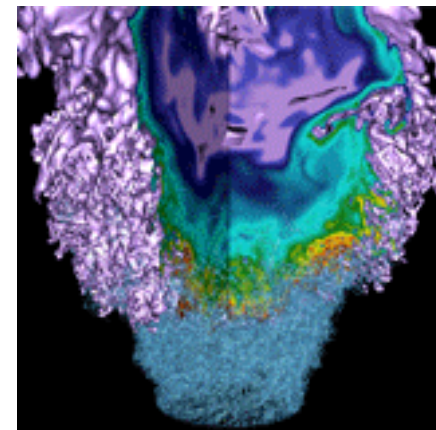


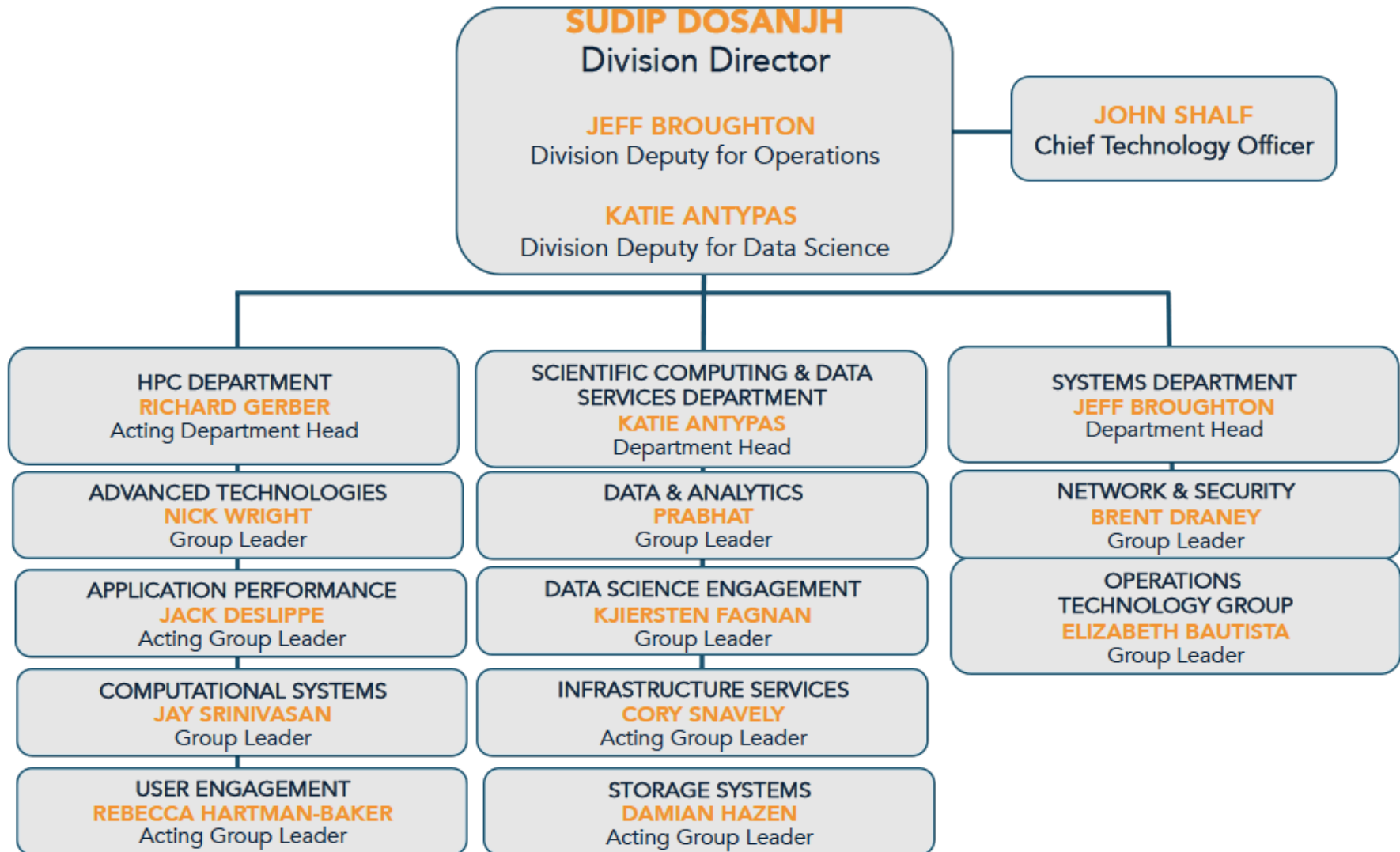
# Data Intensive Science at NERSC



## Prabhat

Data and Analytics Services Group Lead  
March 24, 2016

# NERSC Organization



# DAS Goal: “Enable Data-Intensive Science at Scale”

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- **Internal Goals**

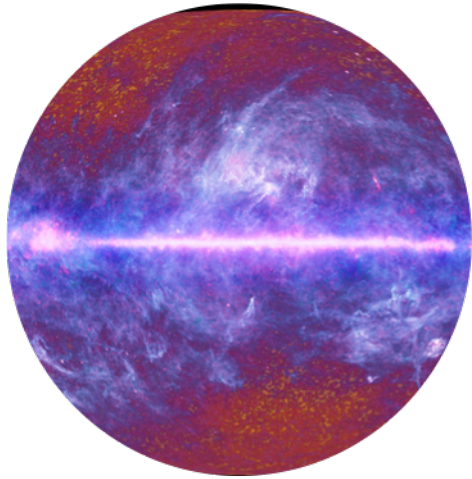
- Provide production quality software services for all major Data capabilities:
  - Analytics, Management, Workflows, Transfer, Access, Visualization
- Pioneer evaluation, research and deployment of Big Data technologies
  - Focusing on productivity and performance
- Engage with stakeholders to enable scientific discovery in a data-driven world
  - Users
  - Computing Sciences Staff
  - Vendors
  - Researchers

# DAS Team

DAS member	DAS capability area	Science expertise
Debbie Bard	Analytics, Workflows	Cosmology, Astronomy
Wahid Bhimji	Management, Transfer	High Energy Physics
Shane Canon	Workflows	KBase, JGI
Shreyas Cholia	Access, Management	
Lisa Gerhardt	Management, Workflows	Particle Physics
Annette Greiner	Access	Systems Biology
Quincey Koziol	Management	
Jialin Liu	Management	
Jeff Porter	Transfer	Nuclear Physics
Prabhat	Analytics, Management	Climate
Evan Racah	Analytics	
Rollin Thomas	Analytics, Access	Astrophysics, Cosmology

# DOE Facilities are Facing a Data Deluge

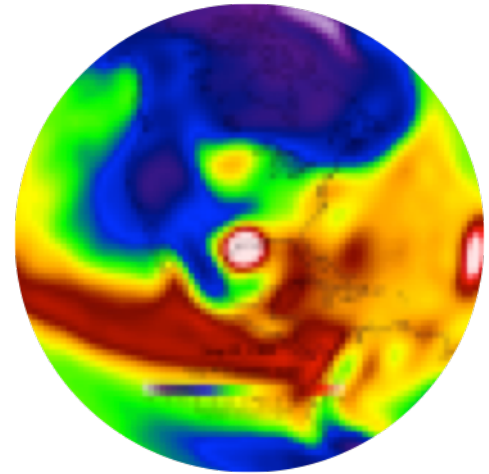
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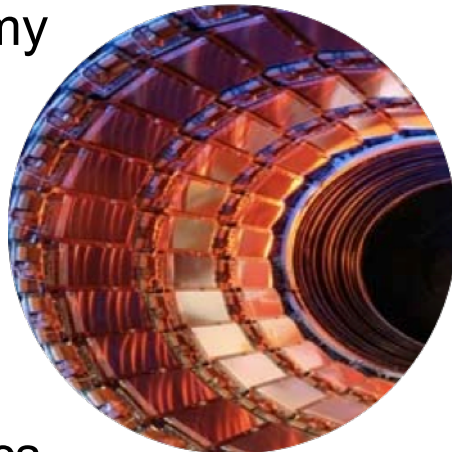
Astronomy



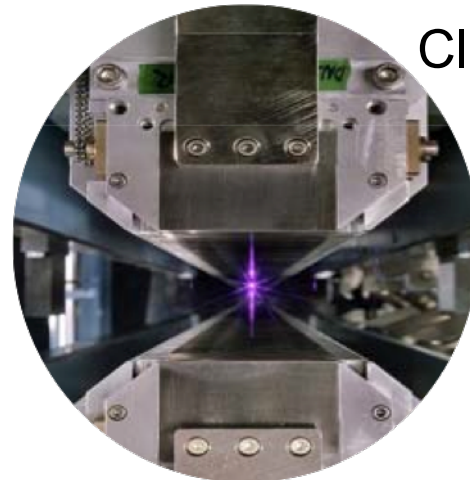
Genomics



Climate



Physics



Light Sources

# 4 V's of Scientific Big Data

Science Domain	Variety	Volume	Velocity	Veracity
Astronomy	Multiple Telescopes, multi-band/spectra	O(100) TB	100 GB/night – 10 TB/night	Noisy, acquisition artefacts
Light Sources	Multiple imaging modalities	O(100) GB	1 Gb/s-1 Tb/s	Noisy, sample preparation/acquisition artefacts
Genomics	Sequencers, Mass-spec, proteomics	O(1-10) TB	TB/week	Missing data, errors
HEP: LHC, Daya Bay	Multiple detectors	O(100) TB – O(10) PB	1-10 PB/s reduced to GB/s	Noisy, artefacts, spatio-temporal
Climate	Simulations Multi-variate, spatio-temporal	O(10) TB	100 GB/s	'Clean', need to account for multiple sources of uncertainty

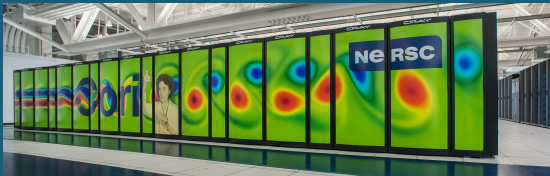
# NERSC - 2016

## Edison: Cray XC-30



5,576 nodes, 133K, 2.4GHz Intel "IvyBridge" Cores, 357TB RAM

## Cori: Cray XC-40



Ph1: 1630 nodes, 2.3GHz Intel "Haswell" Cores, 203TB RAM  
Ph2: >9300 nodes, >60cores, 16GB HBM, 96GB DDR per node

7.6 PB Local Scratch  
163 GB/s

16x FDR IB

28 PB Local Scratch  
>700 GB/s

1.5 PB "DataWarp"  
>1.5 TB/s

32x FDR IB

80 GB/s

50 GB/s

5 GB/s

12 GB/s

Global Scratch

3.6 PB  
5 x SFA12KE

/project

5 PB  
DDN9900 &  
NexSAN

/home

250 TB  
NetApp 5460

HPSS

50 PB stored, 240  
PB capacity

Data-Intensive Systems  
PDSF, JGI, KBASE, HEP  
14x QDR

Vis & Analytics Data Transfer Nodes  
Adv. Arch. Testbeds Science Gateways

Ethernet &  
IB Fabric

Science Friendly Security  
Production Monitoring  
Power Efficiency

WAN

2 x 10 Gb

1 x 100 Gb

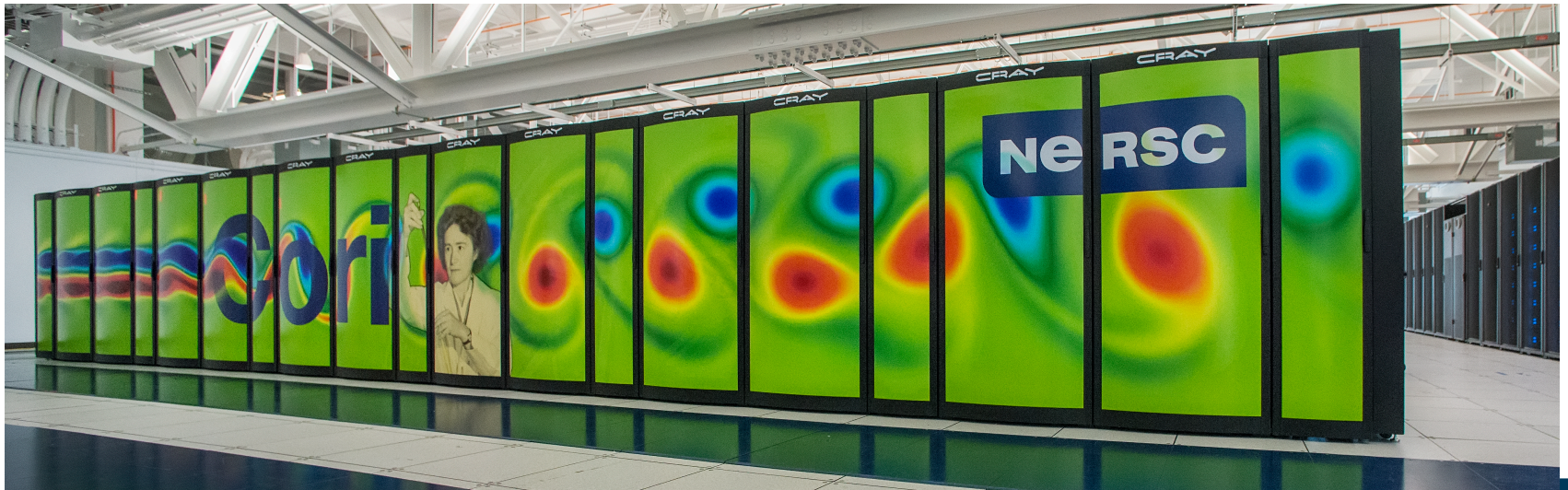
Software Defined  
Networking



# The Cori System

- Cori will transition HPC and Data-intensive workloads to energy efficient architectures

System named after Gerty Cori, Biochemist and first American woman to receive the Nobel prize in science.





# Data-friendly features on Cori

Data Intensive Workload Need	Cori Solution
Fast I/O (local disk)	NVRAM 'burst buffer' Lustre filesystem
Large memory nodes	128 GB/node on Haswell High memory 775 GB/ login node
Complex workflows	14 external login nodes Spark/JupyterHub/workflow software
Communicate with databases from compute nodes	Improved RSIP handles most cases Actively exploring SDN
Stream Data from observational facilities	Software Defined Networking
Easy to customize environment	User-defined images w/ Shifter
Policy Flexibility Turnaround time	Real-time; High throughput; Serial queues Reservations

# Big Data Landscape 2016

## Infrastructure

**Hadoop On-Premise**  
 cloudera, Hortonworks, MAPR, Pivotal, IBM InfoSphere, splice machine, bluedata, jethro

**Hadoop in the Cloud**  
 amazon web services, Microsoft Azure, Google Cloud Platform, IBM InfoSphere, CAZENA, altiscale, Qudale, xplenty

**Spark**  
 databricks, GridGain, TACHYON NEXUS

**Cluster Services**  
 amazon web services, kubernetes, HPCC SYSTEMS, docker, MESOSPHERE, Core OS, pepperdata, StackIQ

## Analytics

**Analyst Platforms**  
 Palantir, AYASDI, Quid, enigma, Digital Reasoning, ORBITAL INSIGHT

**Analytics Platforms**  
 Microsoft, guAVUS, Datameer, interana

**Data Science Platforms**  
 context relevant, CONTINUUM, DataRobot, Alpine, MODE, plotly, ADATAD, dataiku, tonian, DOMINO, what, ALGORITHMIA

**Visualization**  
 Google Cloud Platform, Roambi, QlikData, CHARTIO

## Applications

**Sales & Marketing**  
 RADIUS, Gainsight, bloomreach, Zeta, livefyre, blueyonder, kahuna, Lattice, SAILTHRU, persado, infer, sense, AVISO, ACTIONIQ, QUANTIFIND, N G A G I O

**Customer Service**  
 MEDALLIA, ATTENTIFY, CLARABRIDGE, STELLASERVICE, NGDATA, Preact, DigitalGenius, appurri, fuse:machines

**Human Capital**  
 gold, Connectifier, textio, entelo, hiQ

**Legal**  
 RAVEL, JUDICATA, Everlaw, Brevia, PREMONITION

**NoSQL Databases**  
 amazon DynamoDB, Google Cloud Platform, Microsoft Azure, mongoDB, Couchbase, SequoiaDB, redislabs, Influxdata

**NewsSQL Databases**  
 SAP HANA, Clustring, Pivotal, paradigm4, memsql, nuODB, MariaDB, VOLTDB, citusdata, deep db, Trafalgar, Cockroach LABS

**BI Platforms**  
 Power BI, amazon web services, Domo, Wave Analytics, GoodData, platforma, looker, atscale, ARCADIA, SIBSENSE

**Statistical Computing**  
 sas, SPSS, MATLAB

**Log Analytics**  
 splunk, sumologic, kibana, CLOUD PHYSICS, loggly

**Social Analytics**  
 NETBASE, DATASIFT, trackr, bitly, synthetio, bottlenose, simple reach

**Graph Databases**  
 neo4j, OrientDB, InfiniteGraph

**MPP Databases**  
 TERADATA, VERTICA, NETEZZA, kognitio, dremio

**Cloud EDW**  
 amazon web services, Microsoft Azure, Pivotal, snowflake, WATERLINE DATA, Infoworks

**Data Transformation**  
 alteryx, TRIFACTA, tomr, PAXATA, StreamSets, Alation

**Data Integration**  
 informatica, MuleSoft, snaplogic, BedrockData

**Real-Time**  
 amazon web services, METAMARKETS, confluent, DATATORRENT, dataArtisans

**Machine Learning**  
 Azure Machine Learning, H2O, amazon web services, SKYTREE, rapidminer, DATARPM, deepinsight, VIZENZE, PredictionIO, glowfish

**Speech & NLP**  
 NarrativeScience, api.ai, NUANCE, Dato, Gridspace, semantic machines, corticalio, mindmeld, mlabuba, yseop

**Horizontal AI**  
 IBM Watson, Cortana, sentient, VIV, vicarious, nervana systems, nara, Numenta, MetaMind, clarifai, DEXTR0, Geometric Intelligence

**Management / Monitoring**  
 New Relic, APDYNAMICS, amazon web services, actifio, Numerify, splunk, DATADOG, rocana, Anodot

**Security**  
 TANIUM, illumio, CODE42, DataGravity, CipherCloud, VECTRA, sqrrl, BlueTalon

**Storage**  
 amazon web services, Microsoft Azure, panasas, nimblestorage, Qumulo

**App Dev**  
 apigee, CASK, Typesafe, CONCURRENT

**Crowd-sourcing**  
 amazon mechanicalturk, CrowdFlower, WorkFusion

**Search**  
 hp, Autonomy, ORACLE ENDECA, EXALFREAD, Lucidworks, elastic, ThoughtSpot, MAANA, swifttype, Algolia, SINEOUA

**Data Services**  
 OPERA, MU SIGMA, DATA SCIENCE, SILICON VALLEY DATA SCIENCE, kaggle, DataKind

**For Business Analysts**  
 OrigamiLogic, ClearStory, CIRRO, import io

**SMB / Commerce**  
 Google Analytics, AMPLITUDE, RJMetrics, BLUECORE, sumal, granify, Airtable, retention science, custora

**Publisher Tools**  
 Outbrain, mixpanel, Chartbeat, yieldbot, Yieldmo

**Govt/ Regulation**  
 Socrata, OPENGOV, EN FiscalNote, enigma, PREDPOL, mark43, OpenDataSoft

**Finance**  
 affirm, LandingClub, OnDeck, Kreditech, zest finance, LendUp, Kabbage, tdemark, Puffit, INSIKT, ZUORA, Dataminr, Lendio, KENSHC, AIDYIA, ISENTIUM, Quantopian, sentient

**Cross-Infrastructure/Analytics**  
 amazon web services, Google, Microsoft, IBM, SAP, sas, hp, Autonomy, vmware, talent, TIBC, TERADATA, ORACLE, NetApp

**Education/ Learning**  
 KNEWTON, Clever, Declara, PANORAMA, knowtre

**Life Sciences**  
 23andMe, Counsyl, RECOMBINE, KYRUS, FLATIRON, zymogen, HealthTop, METABIOTA, ZEPHYR HEALTH, ovia, Gingerio, transscriptic, Glow, enlitic, AICure, Atomwise

**Industries**  
 OPOWER, eHarmony, RetailNext, STITCH FIX, duetto, WorkFusion, BLUE@RIVER, TACHYUS, SwiftKey, Seeq, FarmLogs, HowGood, select, SIGHT MACHINE, statmuse, B@XEVER

## Open Source

**Framework**  
 hadoop HDFS, hadoop MapReduce, YARN, Spark, MESOS, TEZ, Flink, CDAP, Apache Kylin

**Query / Data Flow**  
 SLAMDATA, HIVE, DRILL, Google Cloud Dataflow

**Data Access**  
 cassandra, HBASE, mongoDB, CouchDB, riak, SCIO, kafka, nifi, OPENTSDB

**Coordination**  
 talend, Apache Zookeeper, Apache Ambari

**Real-Time**  
 STORM, Spark, APEX, Flink, TACHYON, druid

**Stat Tools**  
 Scala, Numpy, SciPy

**Machine Learning**  
 milib, Aerosolve, Caffe, SINGA, MADlib, TensorFlow, CNTK, FeatureFu, jupyter, DL4J, VELES, WEKA, DIMSUM

**Search**  
 elasticsearch, Solr, Lucene

**Security**  
 Apache Ranger

**Visualization**  
 Zeppelin

## Data Sources & APIs

**Health**  
 Apple, JAWBONE, GARMIN, practicefusion, fitbit, Withings, VALIDIC, netatmo, kinsa, Human API

**IOT**  
 UPTAKE, ThingWorx, helium, samsara, AUGURY, estimate

**Financial & Economic Data**  
 Bloomberg, DOW JONES, YODLEE, PREMISE, S&P CAPITAL IQ, quandl, xignite, CBINSIGHTS, mattermark, estimate, PLAID

**Air / Space / Sea**  
 PLANET LABS, WINDWARD, spire, CRUISE, SKYCATCH, Airware, DroneDeploy

**Location/People/Entities**  
 GARMIN, foursquare, InsideView, esri, STREETLINE, CARTODB, factual, PlaceIQ, Crimson Hexagon, placemeter, BASIS, Sense

**Other**  
 qualtrics, panjiva, DATA.GOV

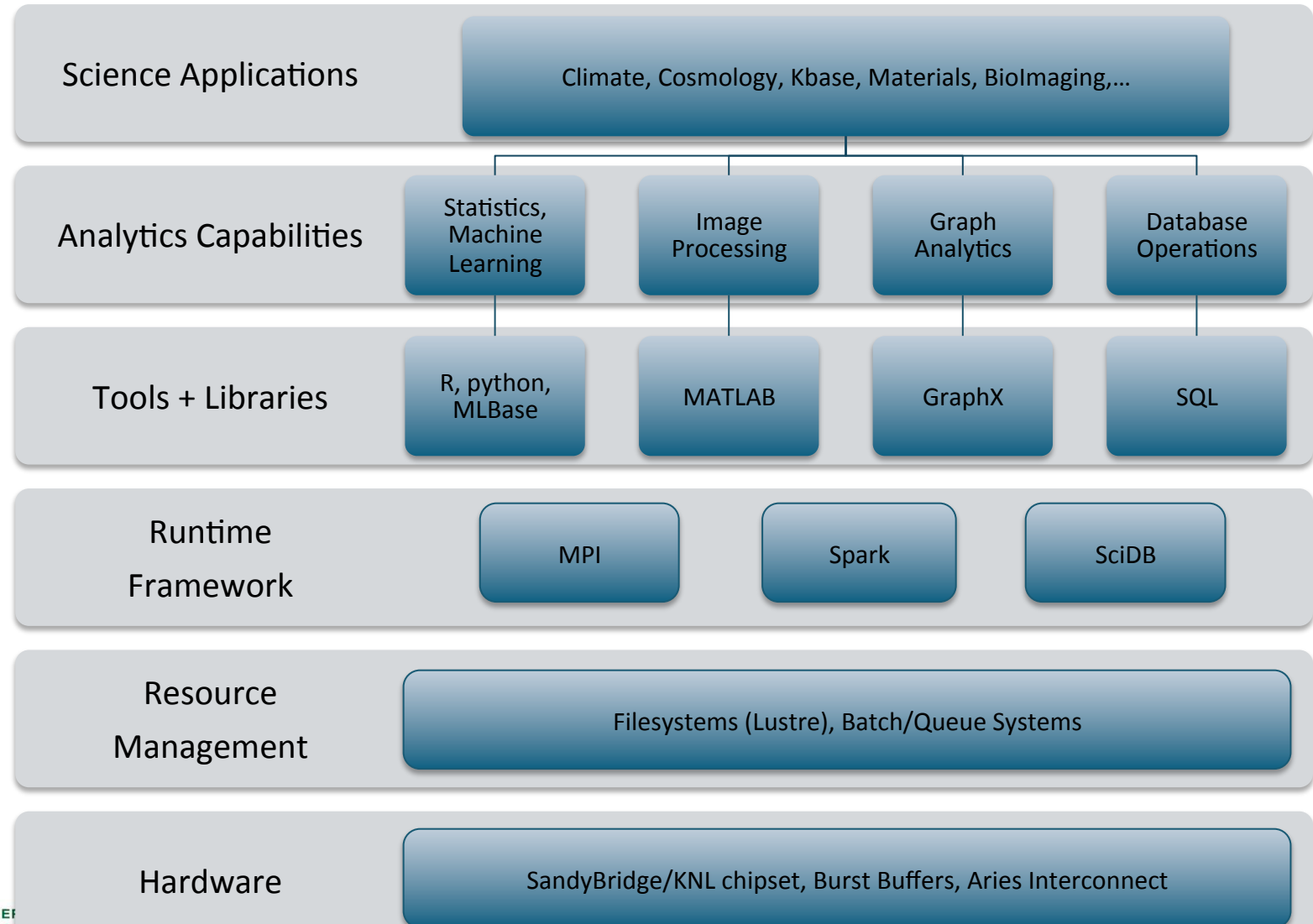
**Incubators & Schools**  
 GA, DataCamp, INSIGHT, DataElite, METIS, The Data Incubator

# Big Data Software Portfolio

Capabilities	Technology Areas	Tools, Libraries
Data Transfer + Access	Globus, Grid Stack, Authentication	Globus Online, Grid FTP
	Portals, Gateways, RESTful APIs	Drupal/PHP, Django/Python, NEWT
Data Processing	Workflows	Swift, Fireworks
Data Management	Formats, Models	HDF5, NetCDF, ROOT
	Databases	MongoDB, SciDB, PostgreSQL, MySQL
Data Analytics	Statistics, Machine Learning	python, R, ROOT, Spark iPython/Jupyter
	Imaging	OMERO, Fiji, MATLAB
Data Visualization	SciVis InfoVis	VisIt, Paraview

	Astronomy	Cosmology	Climate	Systems Biology	Neuroscience	BiImaging	Mass-spec Imaging	Personalized Toxicology	Materials	Particle Physics
Classification	X		X		X	X	X			X
Regression								X	X	
Clustering		X	X		X		X			X
Dimensionality Reduction			X		X		X			
Inference	X						X			X
Model Estimation	X				X			X		
Design of Experiments		X	X						X	
Semantic Analysis			X	X					X	
Feature Learning			X		X		X	X	X	X
Anomaly Detection	X		X							X

# Analytics Software Strategy



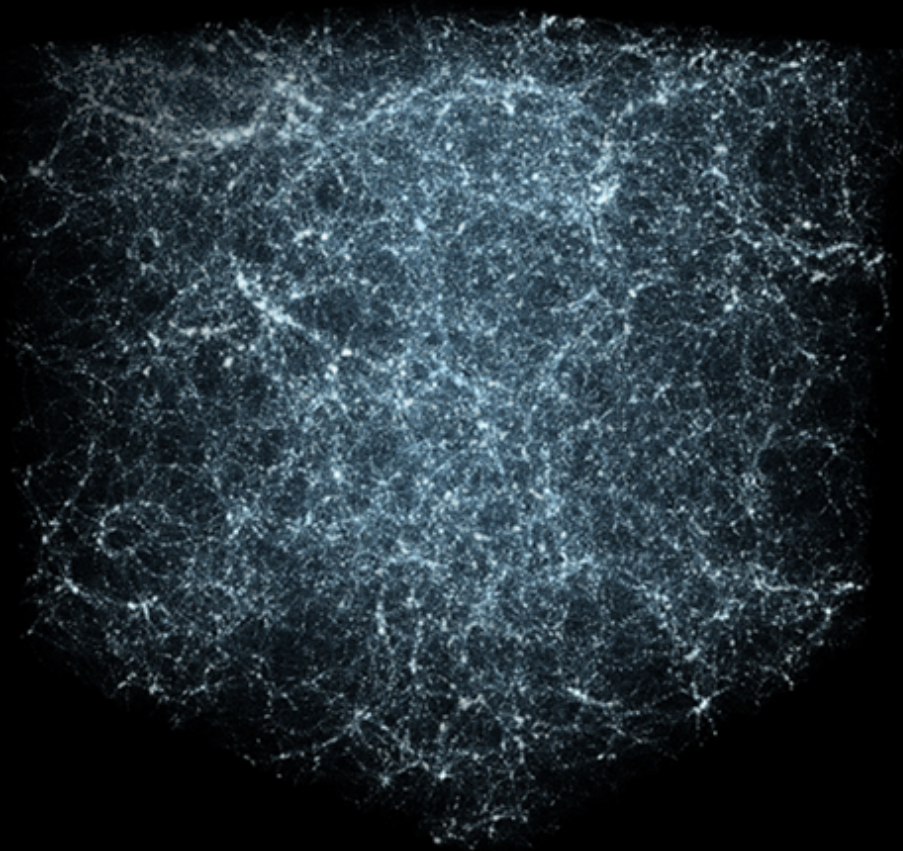
# Data Analytics: Plans for next year

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- **Productivity**
  - Jupyter/iPython notebooks for running codes and interfacing with Cori
- **Performance (HPC and HTC)**
  - Multi-core, multi-node versions of python, R, Spark
  - Processing 1TB datasets on 1,000 cores should be possible *now*
  - Aiming for processing 10TB datasets on 10,000 cores
- **Similar plans are being developed for Management, Transfer/Access, Workflows and Visualization.**

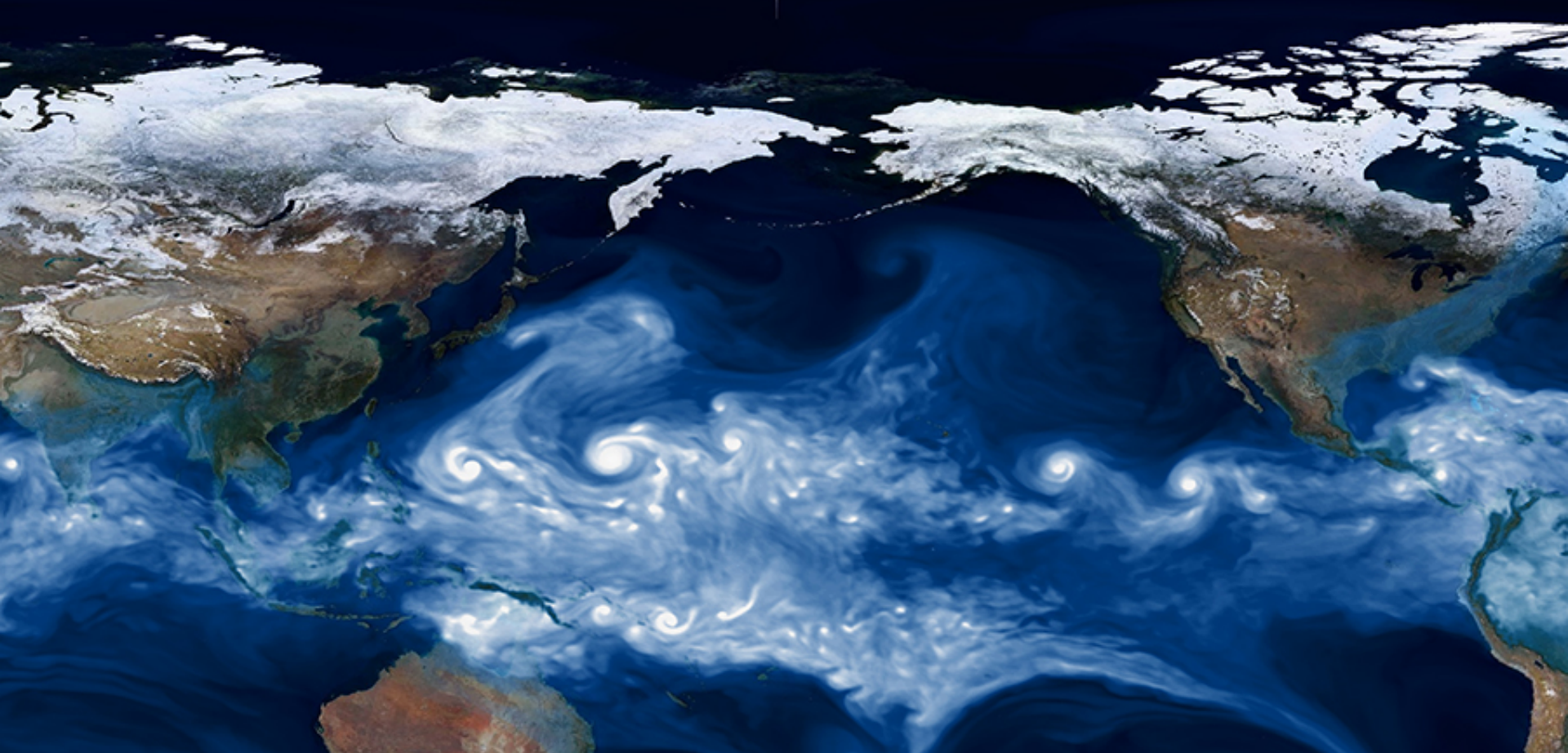
# 1 Creating a catalog of all objects in the Universe

# 2 Determining the Fundamental Constants of Cosmology





# 3 Characterizing Extreme Weather in a Changing Climate



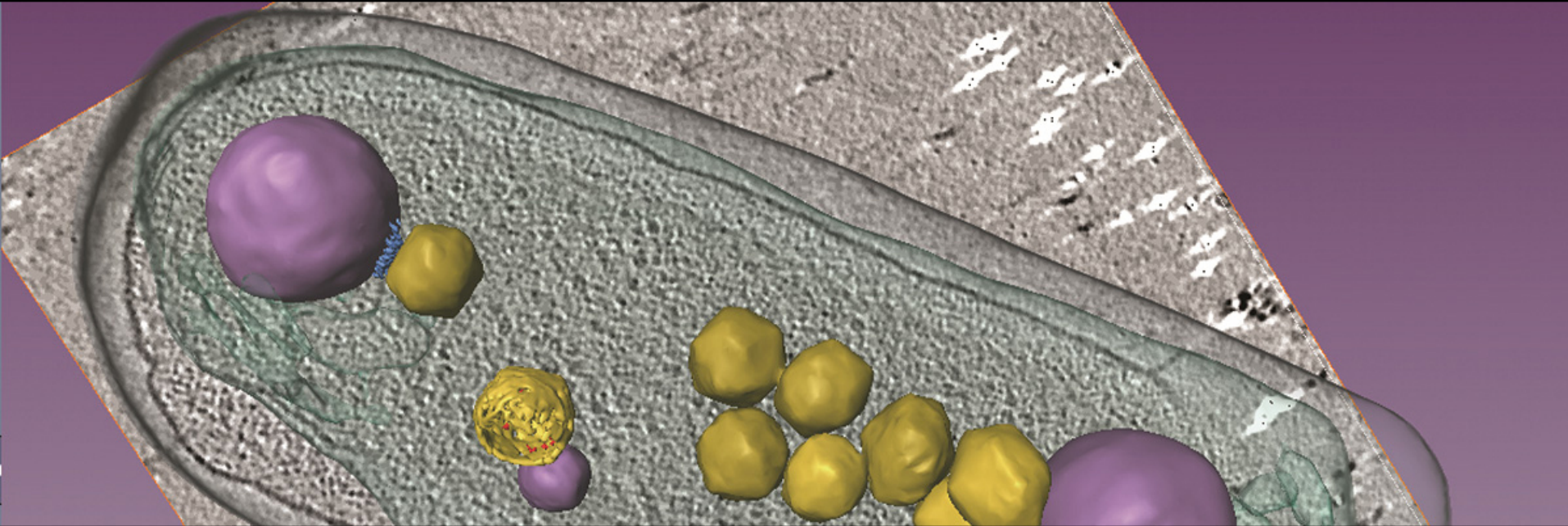
# 4 Knowledge Extraction from Scientific Literature



# 5 Understanding Speech Production



# 6 Quantitative and Predictive Biology



# 7 Understanding the Genetic Code



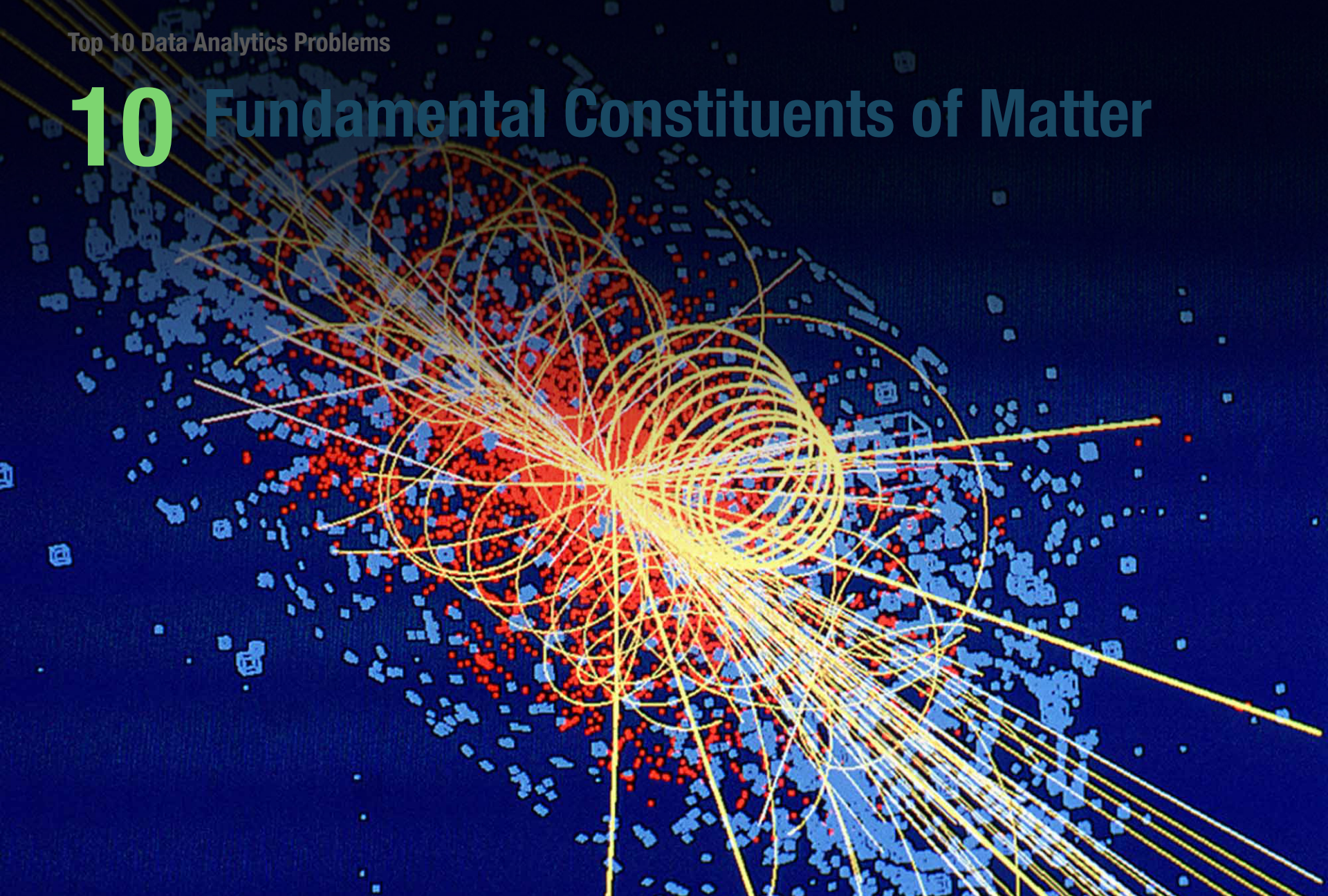
# 8 Personalized Toxicology



# 9 Designer Materials



# 10 Fundamental Constituents of Matter





# Looking to the future: NERSC-9

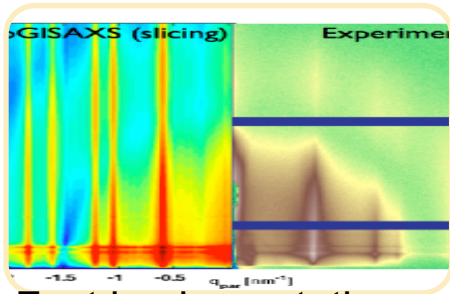
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- **NERSC-9 will build upon the successes of the data components of Cori**
- **End to end workflow requirements and performance are critical for the design and optimization of the system**
- **Overall goal is to enable seamless data motion with dynamic allocation and scheduling of resources**
  - Enable first steps towards exascale-era storage system
  - Vendor community excited about engagement and collaboration opportunities

# Looking to the future: Superfacility



Experimental Facilities



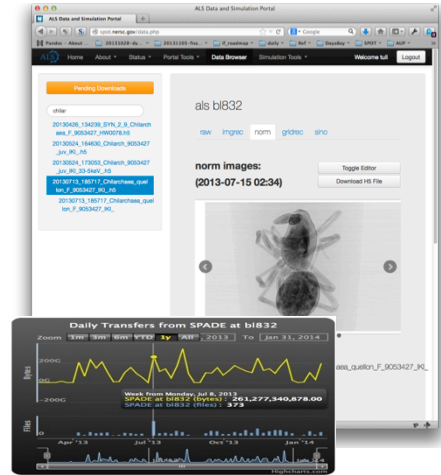
Fast implementations on latest computers



New mathematical analyses



Integrated with ESnet:  
Designed for Big Science Data



Real-time analysis and data management



Computing Facilities

# Conclusions

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- **Exciting time for data-intensive science!**
- **NERSC is in a leadership position**
  - Current: Cori Phase I, Burst Buffer, Policies, Software
  - Future: Cori Phase II, N-9, Superfacility
- **We need your input**
  - Please talk to us about your science problems
  - World-class team is looking forward to working with you

# Questions? Comments?

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Contact: [prabhat@lbl.gov](mailto:prabhat@lbl.gov)