# BIGPANDA: NEXT GENERATION WORKLOAD MANAGEMENT SYSTEM FOR BIG DATA

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# Outline

- Introduction
  - PanDA in ATLAS
  - ASCR project
- BigPanDA 2014 achievements
- Summary

# PanDA Workload management system

- PanDA project was started in Fall 2005
  - Production and Data Analysis system for ATLAS
  - Goal: An automated yet flexible workload management system (WMS) which can optimally make distributed resources accessible to all users
  - Originally developed in US for US physicists
- Adopted as the ATLAS wide WMS in 2008 (first LHC data in 2009) for all computing applications
  - The ATLAS experiment at the LHC Big Data Experiment
  - ATLAS DDM manages ~150 PB of data, distributed world-wide at ~130 WLCG computing centers
  - Expected rate of data influx into ATLAS Grid ~40 PB of data per year
  - Thousands of physicists from ~40 countries analyze the data

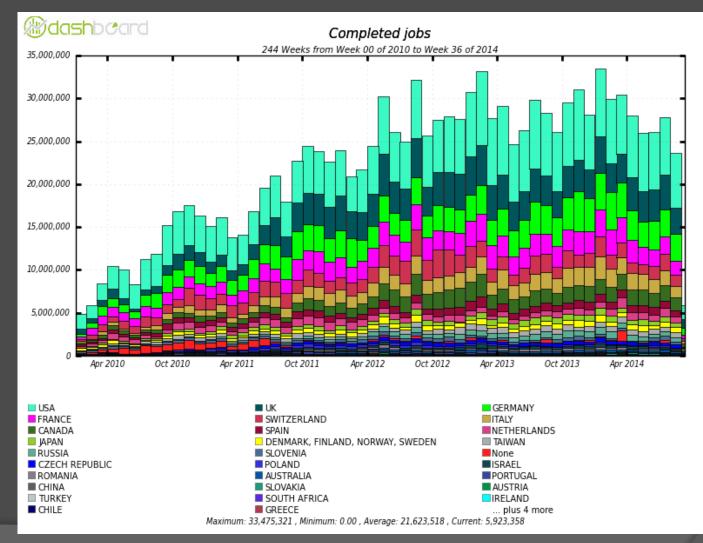
# PanDA WMS design goals

- Achieve high level of automation to reduce operational effort
- Flexibility in adapting to evolving hardware and network configurations
- Support diverse and changing middleware
- Insulate user from hardware, middleware, and all other complexities of the underlying system
- Unified system for central MC production, data processing and user data analysis
- Incremental and adaptive software development

# Key Features of PanDA

- Workflow is maximally asynchronous
- Pilot based job execution system
  - Condor based pilot factory
  - Payload is sent only after execution begins on CE
  - Minimize latency, reduce error rates
- Central job queue
  - Unified treatment of distributed resources
  - SQL DB keeps state critical component
- Automatic error handling and recovery
- Extensive monitoring
- Modular design
- HTTP/S RESTful communications
- GSI authentication
- Use of Open Source components

# Jobs completed by PanDA per month for ATLAS since 2010



## PanDA's Success

- The system was developed by US ATLAS for US ATLAS
- Adopted by ATLAS Worldwide as Production and Analysis system
- It was proven that PanDA can manage in excess of 1 million jobs per day
- Adopted to evolution in ATLAS computing model
- PanDA is exascale now: 1.2 Exabytes of data processed by PanDA in 2013

## Next Generation "Big PanDA"

- ASCR and HEP funded project "Next Generation Workload Management and Analysis System for Big Data". Started in September 2012.
- Generalization of PanDA for HEP and other data-intensive sciences, and a wider exascale community.
- Project participants from ANL, BNL, UT Arlington
- Alexei Klimentov Lead Pl
- WP1 (Factorizing the core): Factorizing the core components of PanDA to enable adoption by a wide range of exascale scientific communities
- WP2 (Extending the scope): Evolving PanDA to support extreme scale computing clouds and Leadership Computing Facilities
- WP3 (Leveraging intelligent networks): Integrating network services and realtime data access to the PanDA workflow
- WP4 (Usability and monitoring): Real time monitoring and visualization package for PanDA

## Next Generation "Big PanDA". Collaborations

- Through ASCR project, PanDA has moved well beyond ATLAS
- Collaboration between ATLAS, ALICE, nEDM experiments for efficient usage of opportunistic resources, especially HPC and LCF
- LSST and AMS uses PanDA for distributed data processing
- Other communities getting involved

# WP1 Factorizing the core

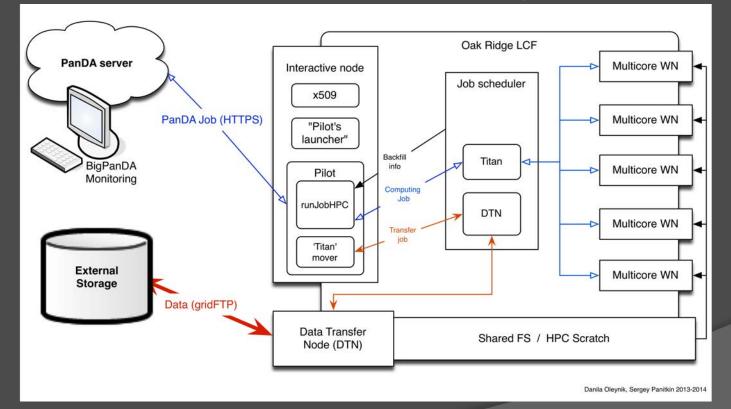
- New Code repository.
  - Migration from CERN SVN to GitHub
  - New build system
  - Distribution through RPMs
- PanDA server improvements.
  - Split core and experiment specific packages
  - Installed dedicated instances for different facilities (now running 3 instances)
- PanDA pilot improvements.
  - Core pilot has been refactored to a generic (VO independent) version;
  - VO specifics are handled as plug-ins;
  - Execution backends are handled as plug-ins
- Multiple database backends.
  - Oracle database backend (ATLAS, AMS)
  - mySQL (running on EC2 PanDA server) LSST, ALICE
- New PanDA monitoring.
  - Redesigned
  - Refactored to ensure modularity
- New PanDA instance with MySQL backend deployed in Amazon EC2
  - Instance tuned for multi-VO support

## WP2 Extending the scope. PanDA @ ORNL LCF.

- Special features of running at LCF
  - Parallel file system shared between nodes.
  - Worker nodes have extremely limited connectivity
  - One-Time Password Authentication
  - Internal job management tool: PBS/TORQUE
  - One job occupy minimum one node (16 cores)
  - Limitation of number of jobs in scheduler for one user
  - Using special data transfer nodes (high speed stage in/out)
- These features developed through ASCR-BigPanDA, going beyond GRID's and clouds

#### WP2 PanDA architecture for Titan

- Pilot(s) executes on HPC interactive node
- Pilot interact with local job scheduler to manage job
- Data, produced on HPC automatically moves to external storage



Started works for integration with NERSC with using same architecture

#### WP2 Backfill on HPC

- A lot of applications can effectively use a single core
- HPC is full, means that the system have allocated all the cycles it is able to deliver
  - It is probably not all cycles available
  - Just as there is room for sand in the jar of rocks, there's
- room for "simple" jobs on even a "full" HPC

#### WP2 PanDA pilot with backfill mode

- PanDA pilot algorithm has been adopted to use backfill information and to submit jobs with optimal parameters
  - Pilot uses SAGA API from complimentary ASCR project
- Special middleware which allows to execute bunch of single node/single threaded workloads transparently, as MPI multi-node workloads, was implemented
- During functional test of Pilot on Titan with realistic payloads (ATLAS and ALICE), efficiency of usage of supercomputer was increased by 2,2%
- We face very small waiting time (avg 70 sec.) for jobs, which ran in backfill mode with optimal parameters

#### WP3 Leveraging intelligent networks

• Why WMS should care about networking?

- Distributed workload management systems need to transfer data (or use direct access) both for input and output
- Data transfer/access is done asynchronously
- Data transfer/access systems can be optimized for network performance – PanDA use these enhancements
- But network information can also be used directly in workflow management in PanDA at a higher level
- Goal for PanDA
  - Direct integration of networking with PanDA workflow never attempted before for large scale automated WMS systems
- Main PanDA use cases
  - Use network information for cloud selection
  - Use network information for job assignment
  - Use network information for site selection

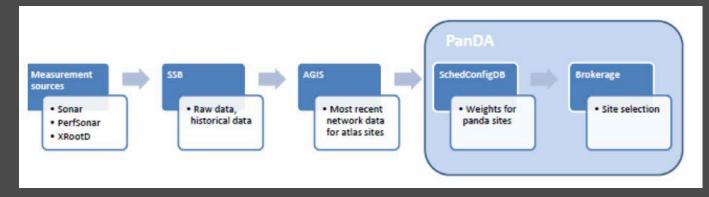
#### WP3 PanDA and Networking. Concept.

#### PanDA as workload manager

- PanDA automatically chooses job execution site
  - Multi-level decision tree task brokerage, job brokerage, dispatcher
  - Also manages predictive future workflows at task definition, PD2P (PanDA Dynamic Data Placement)
- Site selection is based on processing and storage requirements
  - Can we use network information in this decision?
  - Can we go even further network provisioning?
- Further network knowledge used for all phases of job cycle?
- Network as resource
  - Optimal site selection should take network capability into account
    - We do this already but indirectly using job completion metrics
  - Network as a resource should be managed (i.e. provisioning)
    - We also do this crudely mostly through timeouts, self throttling

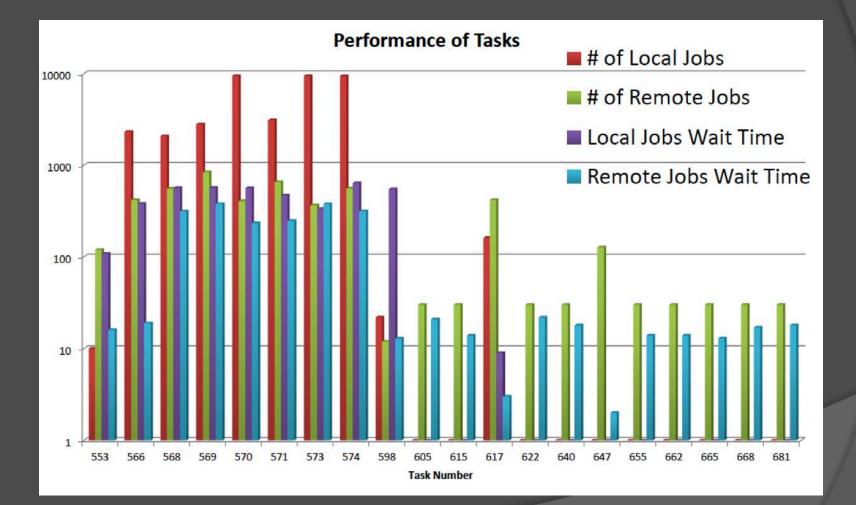
#### WP3 Network Metrics Implementation.

- PanDA WMS was extended with special components:
  - Collecting network metrics from different providers.
  - Organized collected data and arrange it in proper format
- Brokerage takes these data into account for distribution of jobs to sites



 Initial testing showed significant reduction of jobs waiting time

#### WP3 Reduction of waiting time



## WP4 Usability and monitoring

- Complete analysis of previous implementation of PanDA monitoring, showed that this component should be designed from scratch
- New PanDA monitoring web application was developed based on Django framework
  - Allows rapid development and easy extension

### WP4 Usability and monitoring. New PanDA monitoring

http://bigpanda.cern.ch

John -

analysis task summary by cloud, last 7 days Hover over state name to see full name. Task state

Tasks .....

0 2 75 0 95 0 738 14 21 0

Errora ----

Lisens ....

http://pandawms.org

ATLAS PanDA monitor Dashboards

PanDA analysis dashboard, last 12 hours. Query params



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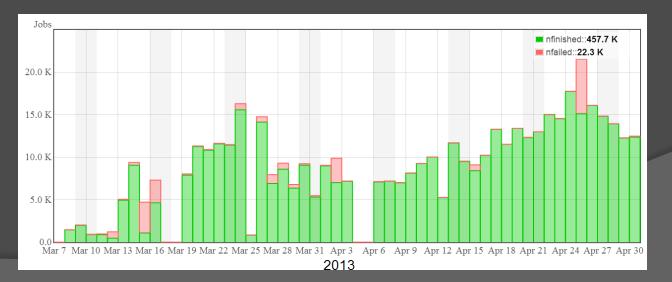
# Summary

Significant progress in all work packages. The project is on schedule

- WP1 Factorizing the core:
  - New GitHub repository is in place. New build system.
  - New PanDA server distribution and installation mechanism via rpm
  - Code refactoring well underway for all components
  - Dedicated PanDA server instance running on EC2 with MySQL backend
- WP2 Extending the scope:
  - Successful integration of PanDA with Titan at OLCF
  - Multiple ATLAS and ALICE workloads ported to Titan
  - Integration of unused resources harvesting capability ("backfill") in PanDA pilot
  - Port of the setup developed on Titan started at NERSC
- WP3 Leveraging intelligent networks:
  - First ever usage of network metrics in distributed workload management system
  - Significant reduction of waiting time for jobs
- WP4 Usability and monitoring:
  - New PanDA monitoring

# Backup. PanDA @ GCE

- In 2013 PanDA was successfully tested with Google Compute Engine
  - We ran for about 8 weeks
  - Very stable running on the Cloud side. GCE was rock solid.
  - We ran computationally intensive jobs
  - Physics event generators, Fast detector simulation, Full detector simulation
  - Completed 458,000 jobs, generated and processed about 214M events



## Backup. PanDA@OLCF. Functional testing results (June-July)

- In May 2014 we ran first 24 hour continuous job submission test via PanDA@EC2 with pilot in backfill mode, with MPI wrappers for two workloads from ATLAS and ALICE
  - Stable operations
  - ~22k core hours collected in 24 hours
  - Observed encouragingly short job wait time on Titan ~4 minutes
- Ran second 24 hour test in July 2014, with pilot modifications that were based on information obtained from the first test
  - Limit on number of nodes was removed in pilot
  - Job wait time limit introduced 5 minutes. Simple "kill job"
  - ~145k core hours collected
  - Average wait time ~70 sec
  - Observed IO related effects that need to be understood better

## Backup. PanDA@OLCF. Functional testing results (August)

- Testing algorithm for internal rescheduling of payload in pilot
  - Pilot gets free resource information from Titan's resource manager
  - Forms job parameters according to free resources and queue policies
  - Submits job to PBS
  - If job exceeds wait time limit, pilot cancels the job and repeats the cycle
- Wait time limit for a job in PBS was set to 2 minutes
- Ran continuously for ~10 hours
- Highly CPU bound payload to avoid IO issues
- Were able to collect ~ 200,000 core hours
- Max number of nodes per job 5835 (93360 cores)
  - Close to entire Grid in size!
- Used ~2.3% of all Titan core hours or ~14.4% of free core hours