# Towards multi-parameter resource selection for HPC platforms

Master Research Thesis

Dineshkumar RAJAGOPAL (PDES - MoSIG)

advised by

Yiannis GEORGIOU

Big Data and Security(BDS) lab, BULL-SAS September 1, 2015







- Introduction & Motivation
- Background

- Related Works
- SLURM Architecture
- LAYOUTS Framework
- Resource Selection
  - LAYOUTS based consumable resource selection
  - Multi-parameter resource selection
- 4 Experiments & Performance Evaluation
  - Cons\_res\_layout vs Cons\_res Analysis
  - Multi-parameter vs Cons\_res Analysis
- Conclusion & FW
  - Conclusion
  - Future Work

## HPC System Software Stack

- Supercomputer is a HPC Cluster
- Usage: Computationally intensive tasks in Scientific Experiments (Quantum mechanics, Weather Prediction, etc)

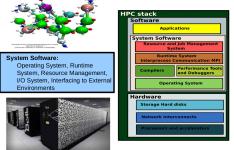


Image credit: Yiannis georgiou, BULL

#### What is RJMS?

Introduction & Motivation

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- The goal of a Resource and Job Management System (RJMS) is to satisfy users demands for computation and assign resources to user jobs with an efficient manner
- Q RJMS knows the complete details about the Jobs and Resources of HPC system

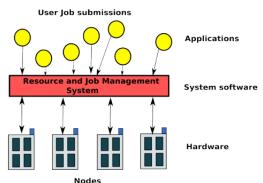


Image credit: Yiannis

#### Motivation of Resource Selection

- Resource selection is an internal operation of scheduling
- ② Due to the the evolution of HPC platform and internal nodes architecture, Resource Management is dynamic and complex
- Improper resource management hides resources information to lose global view of resources
- Power wall problem and the increasing number of nodes in HPC systems, energy efficiency is the important criteria
- Multi-parameter resource selection to satisfy different criteria to allocate resources perfectly

Feature	OAR	SLURM	FLUX
Programming	Perl, MySQL	C, autoconf	C, autoconf
Tools			
Puropse	Scalable & Flexible	Scalable, Flexible &	Scalable, Flexible &
		Performance	Distributed resource
			& job management
Resource Man-	Flat Hierarchical	Linear & Managed in	Dynamic & Flat
agement	& managed in the	its own data struc-	hierarchical re-
	Databse	ture(bitmap & list)	source management
			framework
Resource Selec-	Best-fit for Intel	Best-fit for different	Next generation
tion	cluster architecture,	cluster architecture,	RJMS, only frame-
	SQL querry to	custom implementa-	work core function-
	perform selection	tion of algorithm	ality developed
Topology Aware-	Yes	Yes	Not Yet imple-
ness			mented
Internal Resource	Yes	Yes	Not Yet imple-
Consumption			mented

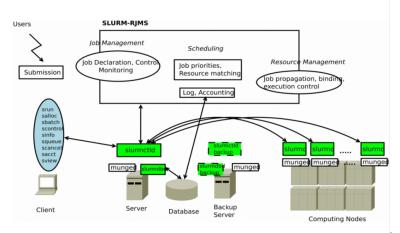
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#### SLURM Architecture

Background

Introduction & Motivation

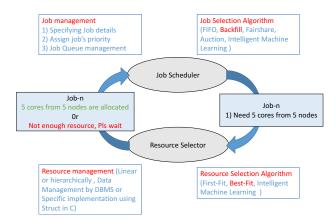
#### SLURM is an open source RJMS for Supercomputer



Conclusion & FW

#### Batch Scheduling

- Scheduling behaviour depends on the Job scheduler and Resource selector behaviour
- Resource Selection is an internal operation of scheduling



#### Resource Selection Cycle

- Select and Topology plugin work together to allocate topology aware resources
- Topology plugin has information of Switch and Node relationship in bitmap, so comparison of two nodes list is very fast and scalable with less memory foot-print



- 2 Background

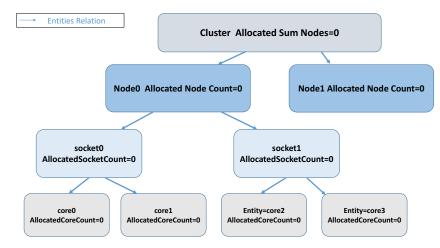
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#### LAYOUTS Framework

- LAYOUTS is the new resource management framework in **SLURM v15.08**
- Any type of entities can be manageable
- Entities relation is tree (Inspiration of OAR resource management)
- Entity attribute is called in LAYOUTS key, stored in the hash key-value format
- 6 Keeping consistency among attributes values across entities based on keys inheritance relations
- © Entities information is available in the different level of resource hierarchy to reveal hidden information of resources

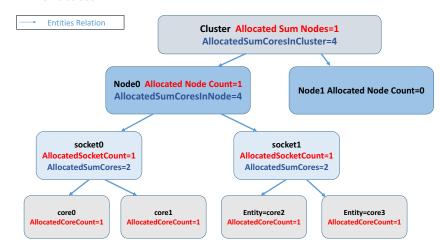
#### LAYOUTS Entity Keys and Key Relation

If all the cores are allocated in the node, then the node is allocated



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If all the cores are allocated in the node, then the node is allocated



#### LAYOUTS Basic APIs

- layouts\_entity\_get\_kv() get key value
- layouts\_entity\_set\_kv() set key value
- layouts\_entity\_pull\_get\_kv() update key relation value and get key value
- ayouts\_entity\_set\_push\_kv() set key value and update key
  relation

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#### Cons\_res\_layout Implementation

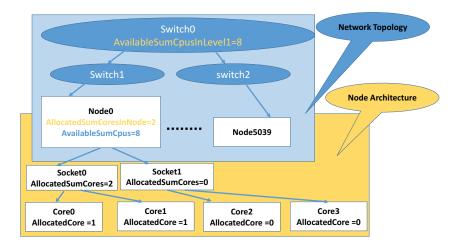
- Ocons\_res is the consumable resource selection plugin
  - Best-fit to select minimum satisfiable resources than maximum satisfiable resources
  - Topology aware to increase the user application performance
  - Cons\_res consumes internal resources of nodes(cores, memory, etc)
  - Algorithm 1 in the section 4.1 of the report discussed the algorithm step by step
  - Cons\_res used list and bitmap to keep resource information

Conclusion & FW

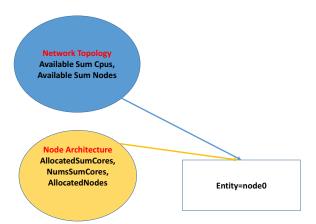
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  - Cons\_res used list and bitmap to keep resource information
- Cons\_res\_layout is the new consumable resource selection plugin based on LAYOUTS
  - Naive implementation of cons\_res\_layout plugin performance was 25 times slower
  - Second version of the cons\_res\_layout code used a combination of bitmaps, layouts to reach the performance of default cons res code

#### Layouts Interrelation



#### Entity Global View

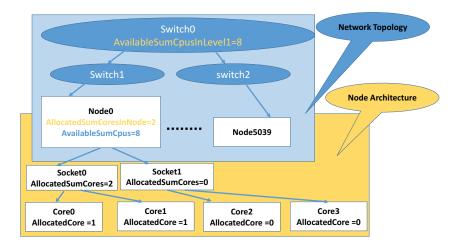


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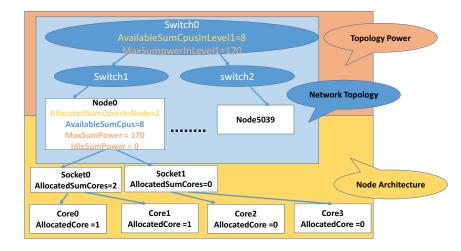
#### Multi-parameter Resource Selection Algorithm

- Bestfit energy efficiency to reduce energy consumption in the Heterogeneous power consuming cluster
  - Minimum power consuming allocated nodes
  - Already allocated nodes than idle nodes
  - Minimum power consuming idle nodes
- Topology aware to increase the user application performance
- Algorithm 2 in the section 4.2 of the report discussed the algorithm step by step
- Advantage: Multi-parameter(Cons\_res\_power) resource selection supports user's performance and server's energy criterias

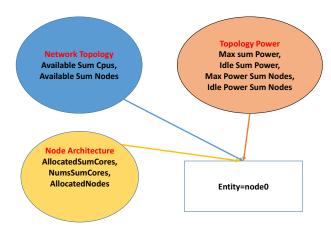
#### Layouts Interrelation



#### Layouts Interrelation(Ctd...)



#### Entity Global View



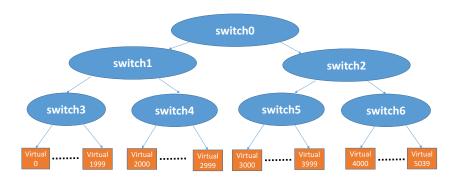
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#### **Experiment Environment**

- Emulate real HPC environment using —enable-multiple-slurmd option
- Synthetic workload of Enhanced System Performance(ESP) Benchmark
- Use sleep, hostname like simple application
- Standard Workload Format(SWF) to store workload
- BULL CUZCO cluster 17 nodes to emulate 5040 nodes HPC cluster
- Each node configured as 2 sockets, 16 cores and 32GB of memory, more details are in Appendix C.1

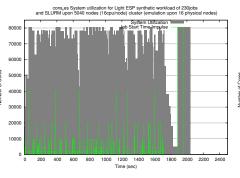
#### Topology Experiment Environment

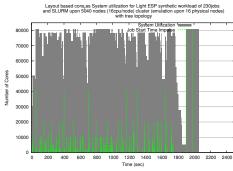
- Momogeneous cluster environment
- Simple tree topology to have 4 leaf switches and 3 levels



#### Cons\_res vs Cons\_res\_layout system utilization

System utilization is almost same, because of following same policy



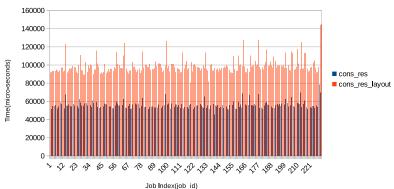


#### Individual Jobs Performance Comparison

• Due to large number of entity update in Cons\_res\_layout plugin, individual resource selection time increased twice

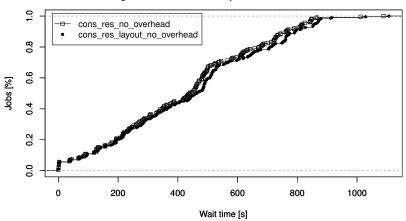
cons\_res and cons\_res\_layout resource selection performance

(complete schedule-select cycle time in micro-seconds)



#### Waiting Time for 2 Plugins

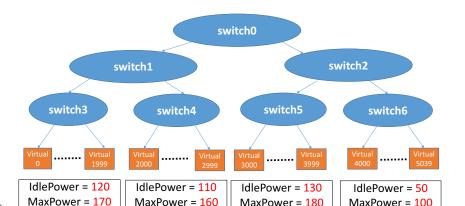
#### CDF on Wait time between 2 resource selection for for Light-ESP benchmark upon a 80640 cores cluster



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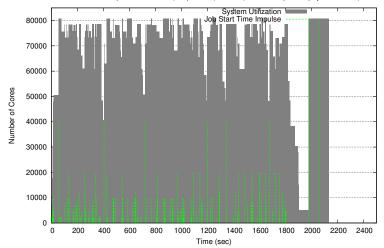
#### **Energy Experiment Environment**

- Heterogeneous power consuming nodes cluster environment
- Simple tree topology to have 4 leaf switches and 3 levels
- Homogeneous power consuming nodes within leaf switches



#### Cons\_res\_power System Utilization

Layouts based cons<sub>r</sub>es<sub>p</sub>ower System utilization for Light ESP synthetic workload of 230jobs and SLURM upon 5040 nodes (16cpu/node) cluster (emulation upon 16 physical nodes)

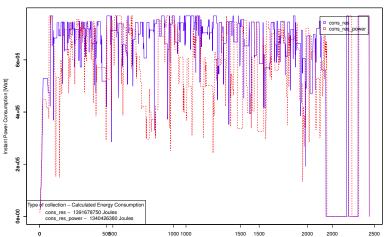


#### Energy Efficiency

Introduction & Motivation

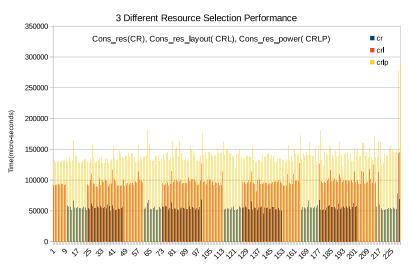
Cons\_res\_power energy consumption is less than Cons\_res by 3.8% (51252370 Joules) for same job workload

Power consumption comparison of 2 policies cons\_res and cons\_res\_power



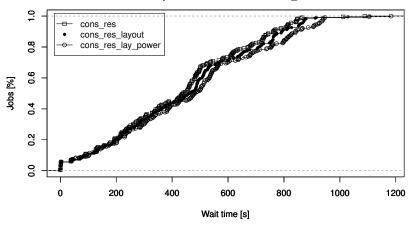
#### Individual Jobs Performance Comparison

 Cons\_res\_power individual job resource selection time increased thrice than cons\_res



# Waiting Time for 3 Plugins

# CDF on Waiting time for Light–ESP benchmark upon 5040 nodes (16 cores/node) clust comparison of 3 different cons res



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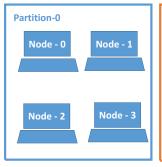
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- Multi-parameter resource selection policy adapted in cons\_res\_layout plugin
- Energy consumption of multi-parameter resource selection reduced by 3.8 % and minimal increase of resource selection performance overhead

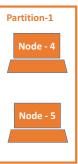
#### Future Work

- Support partition entities and fat-tree topology in the layouts plugins
- Adapt cons\_res\_power to support real energy values from RAPL or IPMI technique
- Include temperature criteria in the resource selection
- Experiment to measure
  - Perform scalability experiments with large number of nodes
  - Instantaneous job throughput
  - Instantaneous number of job types allocated
  - Cons\_res\_ power job waiting time is better than powercapping only approach

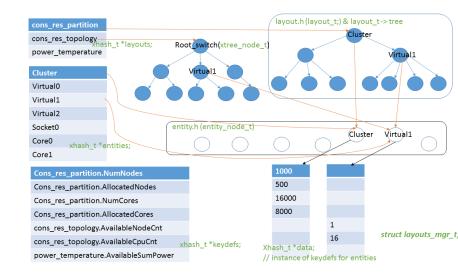
### **SLURM Entities**

- **1** SLURM **resource management** entities
- 2 Job management entities are not considered





#### LAYOUTS Internal Architecture



# LAYOUTS Aggregate Keys

- Child aggregate functions Specific operations performed on the children key value and update the calculated value in the parent's key
  - MEYSPEC\_UPDATE\_CHILDREN\_SUM
  - KEYSPEC\_UPDATE\_CHILDREN\_AVG
  - KEYSPEC\_UPDATE\_CHILDREN\_MIN
  - KEYSPEC\_UPDATE\_CHILDREN\_MAX
  - KEYSPEC\_UPDATE\_CHILDREN\_COUNT
  - KEYSPEC\_UPDATE\_CHILDREN\_MASK
- Parent aggregate functions
  - MEYSPEC\_UPDATE\_PARENTS\_SUM
  - KEYSPEC\_UPDATE\_PARENTS\_AVG
  - KEYSPEC\_UPDATE\_PARENTS\_MIN
  - KEYSPEC\_UPDATE\_PARENTS\_MAX
  - KEYSPEC\_UPDATE\_PARENTS\_FSHARE
  - KEYSPEC\_UPDATE\_PARENTS\_MASK

### LAYOUTS New APIs

New APIs developed for **new functionality** and **performance** purpose.

- layouts\_entity\_get\_parent\_name()
- layouts\_multi\_entity\_set\_kv() set entity same key
- layouts\_multi\_entity\_get\_kv()
- layouts\_entity\_pull\_get\_skv() update specific key and its
  relations
- layouts\_entity\_set\_push\_skv()

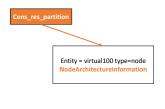
- Node and Core list is maintained in the bitmap data structure to compare and match another node list faster
- LAYOUTS to access entities keys in the different levels

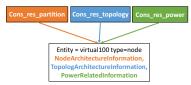
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- layouts\_multi\_entity\_set\_kv transfer information from one layout to another

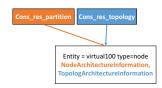
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- layouts\_multi\_entity\_set\_kv transfer information from one layout to another
- layouts\_entity\_pull\_get\_skv update only specific key values
- Topology aware resource selection algorithm was adapted for normal tree topology

# LAYOUTS Entity Data Management

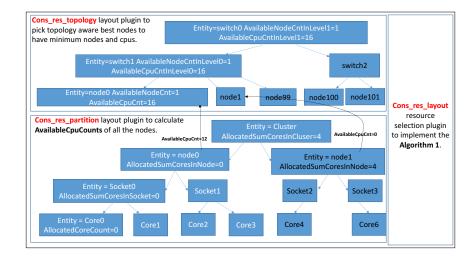




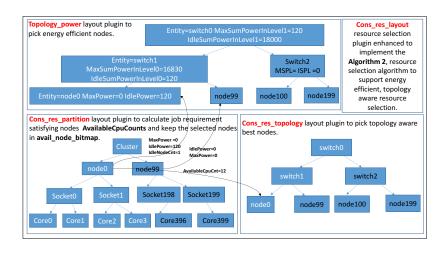


- Entity and entity keys are in hash data structure and access very fast
- Entity has different layouts plugin information to view entity different perspective

### Cons\_res\_layout Architecture



### Cons\_res\_power Architecture



 SLURM plugin enhancement is easier using LAYOUTS resource management framework

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- Ons\_res\_layout individual resource selection performance overhead was increased twice than cons\_res plugin
- **6** Cons\_res\_layout job waiting time increased, due to individual performance of resource selection

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- Cons\_res\_power job waiting time increased, due to individual performance of resource selection