

www.bsc.es



**Barcelona
Supercomputing
Center**

Centro Nacional de Supercomputación

BSC Tools

Detecting and analyzing application structure
with clustering

Judit Gimenez (judit@bsc.es)

Extreme-Scale Performance Tools
- SC12 workshop

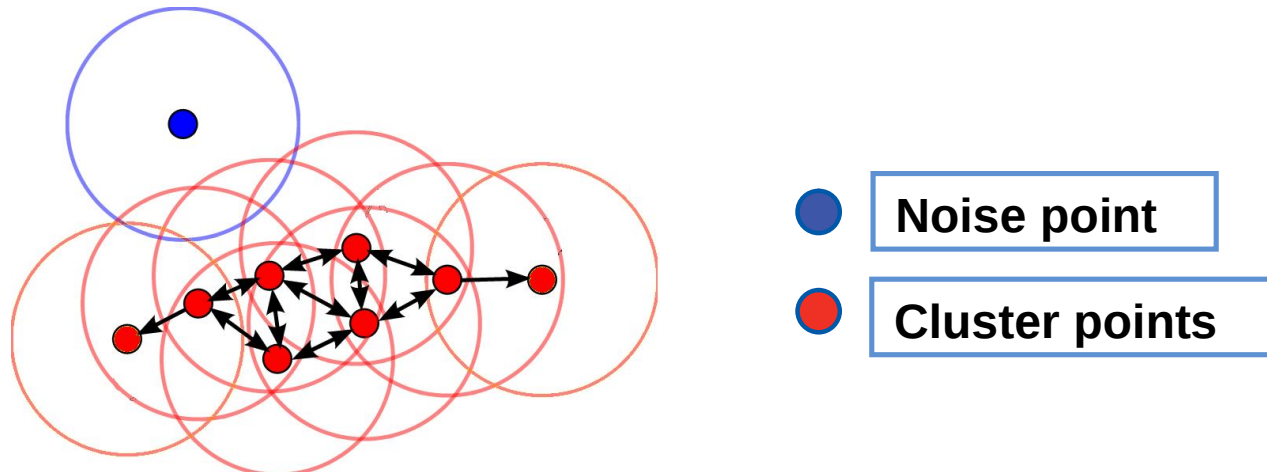
Clustering

« Identification of computation structure

- CPU burst = region between consecutive runtime calls
 - Described with performance hardware counters
 - Associated with call stack data

« Using DBSCAN density-cluster algorithm

- Data not necessarily Gaussian
- Two parameters: Epsilon (search radius), MinPoints



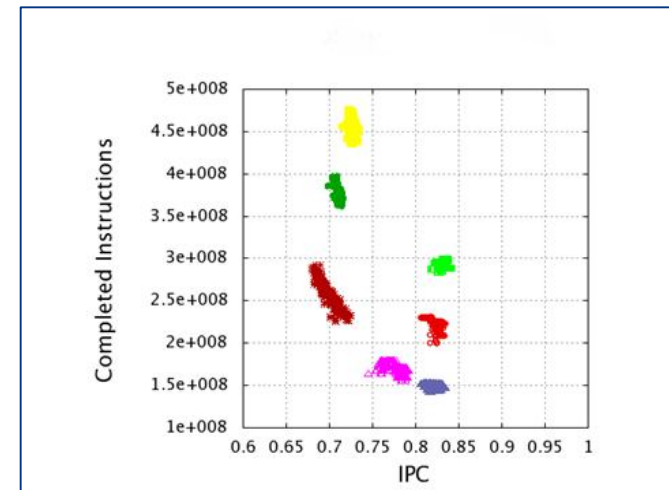
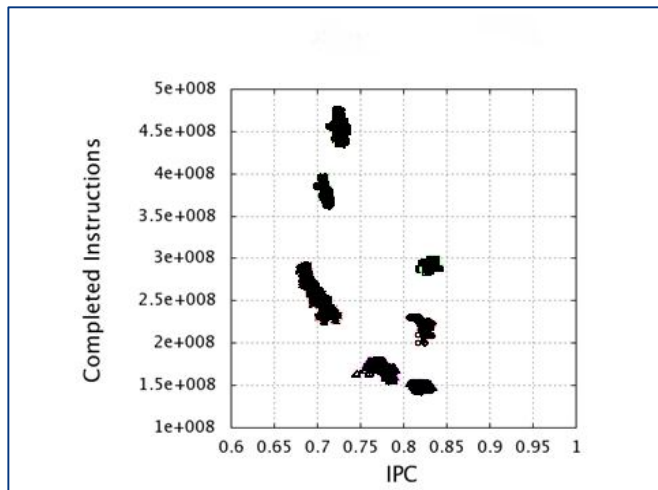
Clustering

« Identification of computation structure

- CPU burst = region between consecutive runtime calls
 - Described with performance hardware counters
 - Associated with call stack data

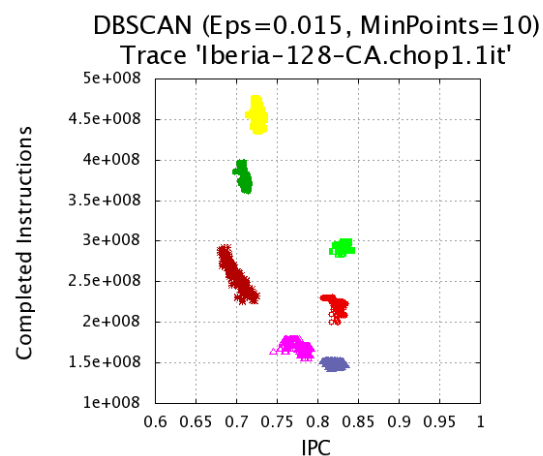
« Using DBSCAN density-cluster algorithm

- Data not necessarily Gaussian
- Two parameters: Epsilon (search radius), MinPoints

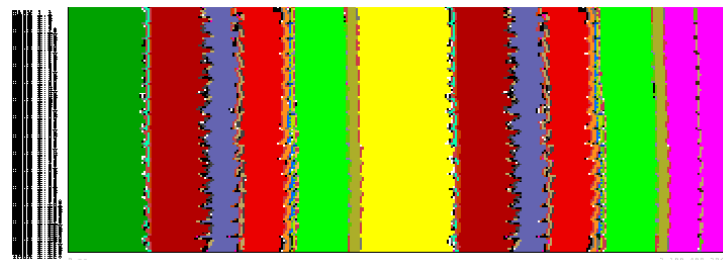


Outputs

Scatter Plot of Clustering Metrics



Clusters Distribution Along Time



Cluster Statistics

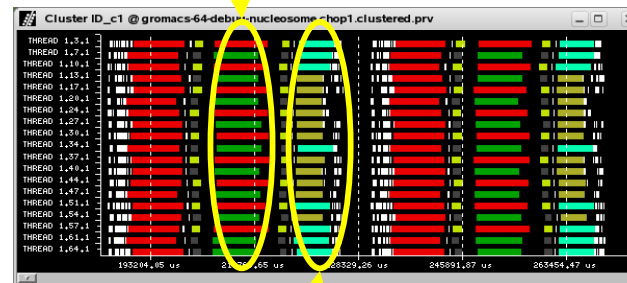
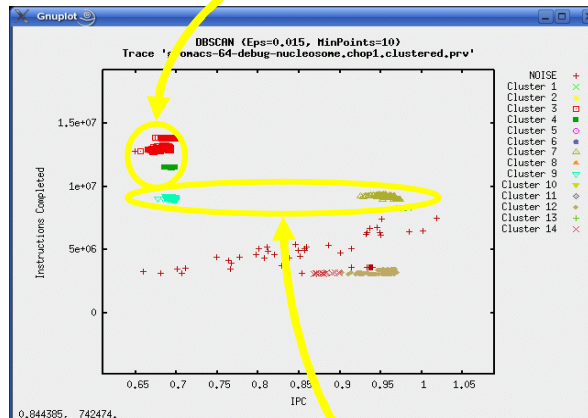
CLUSTER	1	2	3	4	5	6
% TIME	36.29	29.52	10.13	9.68	3.73	1.71
AVG. BURST DUR. (MS)	220.46	177.70	60.81	29.09	38.71	44.83
All counters in a single run						.59
						8.24
L1M/KINSTR	22.72	32.63	12.65	8.39	16.12	6.86
L2M/KINSTR	0.59	1.23	1.08	0.61	1.23	1.73
MEM.BW (MB/s)	90.77	182.65	193.32	136.33	236.15	295.71

Code Linking

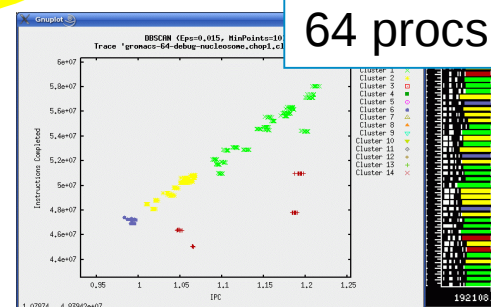
CLUSTER	CODE SECTION
1	solve_nmm.f:[2037 - 2310]
2	solve_nmm.f:[1478 - 1782] solve_nmm.f:[2030 - 1782]
3	solve_nmm.f:[1241 - 1345]
4	solve_nmm.f:[2771 - 2865] solve_nmm.f:[2388 - 2489]
5	solve_nmm.f:[1478 - 1569]
6	solve_nmm.f:[1607 - 1633]

Using clusters to understand apps behavior (GROMACS)

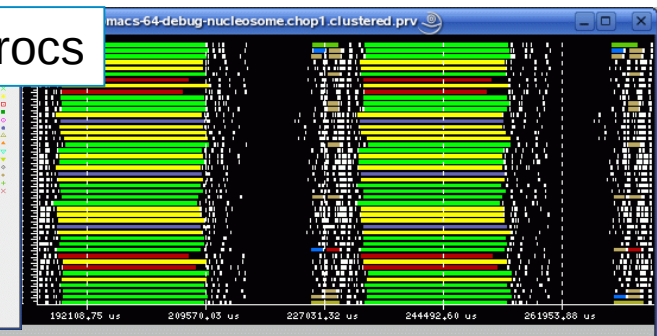
Instructions imbalance



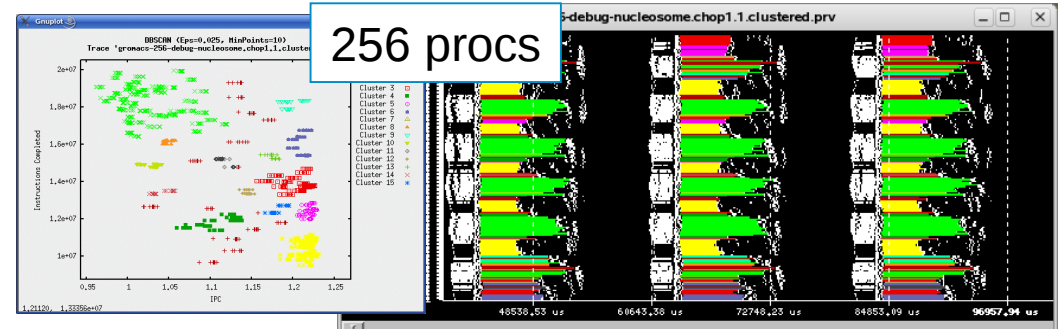
IPC Imbalance



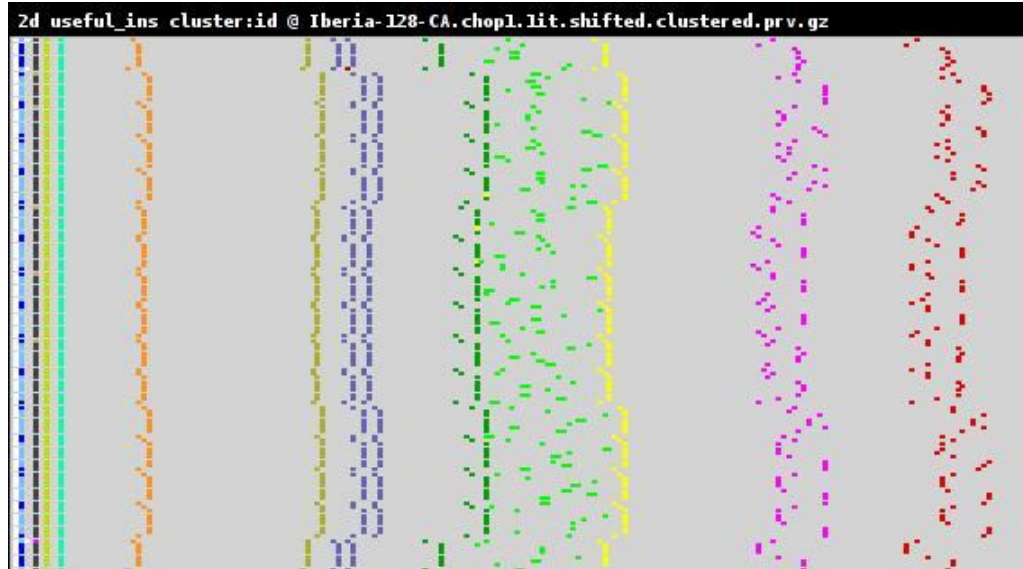
64 procs



256 procs



Identifying main code regions

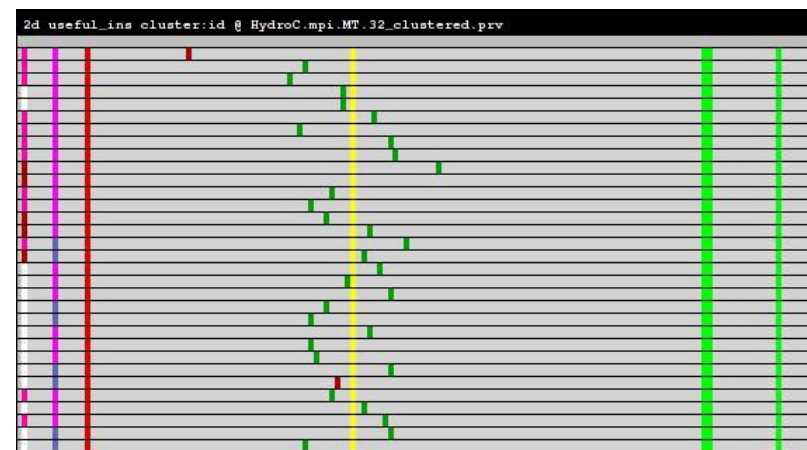


WRF

instr. vs. cluster

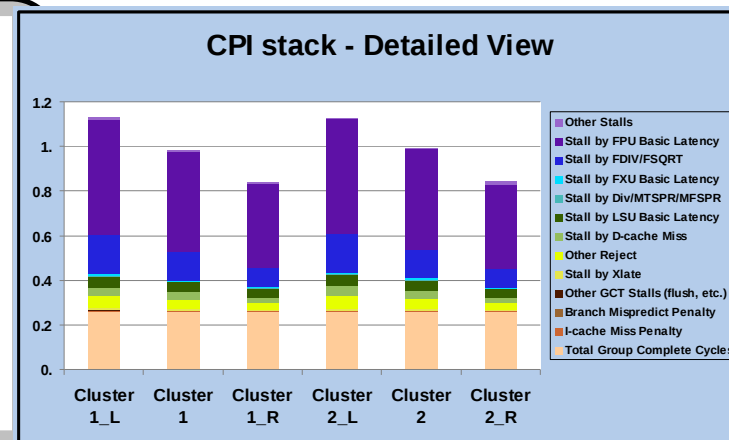
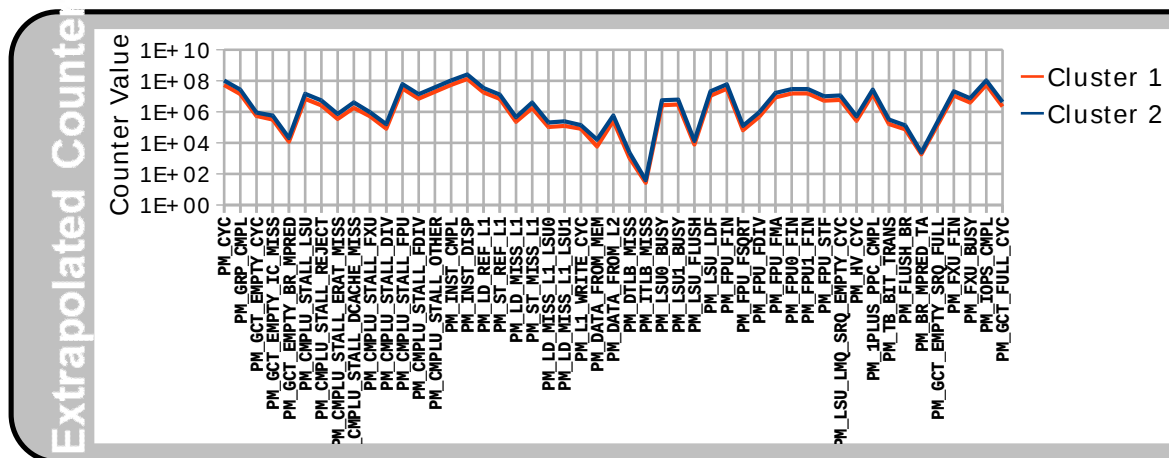
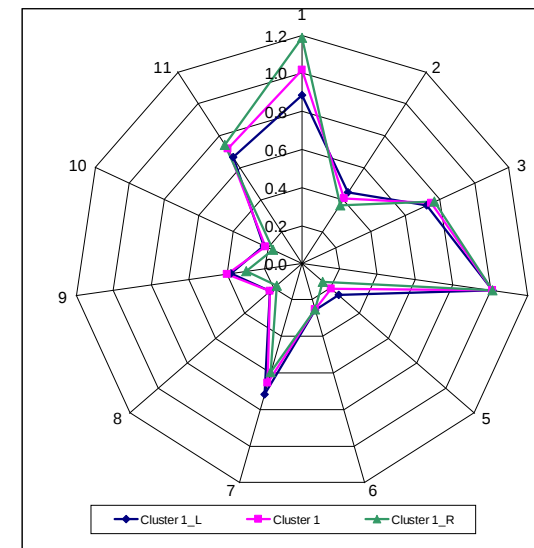
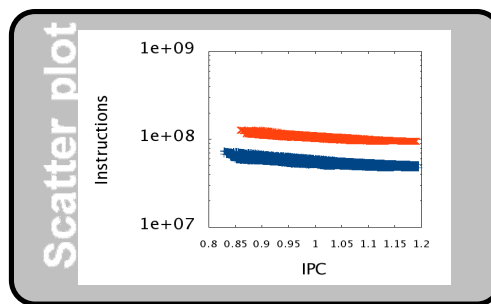
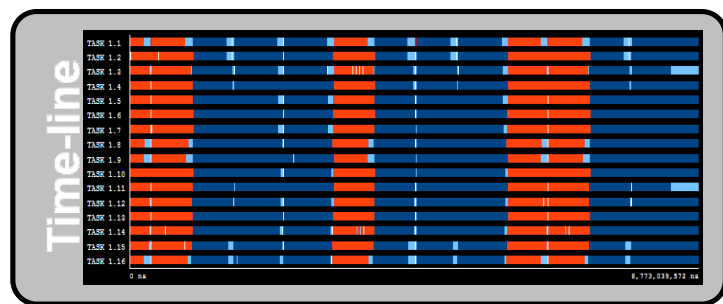


CG-POP

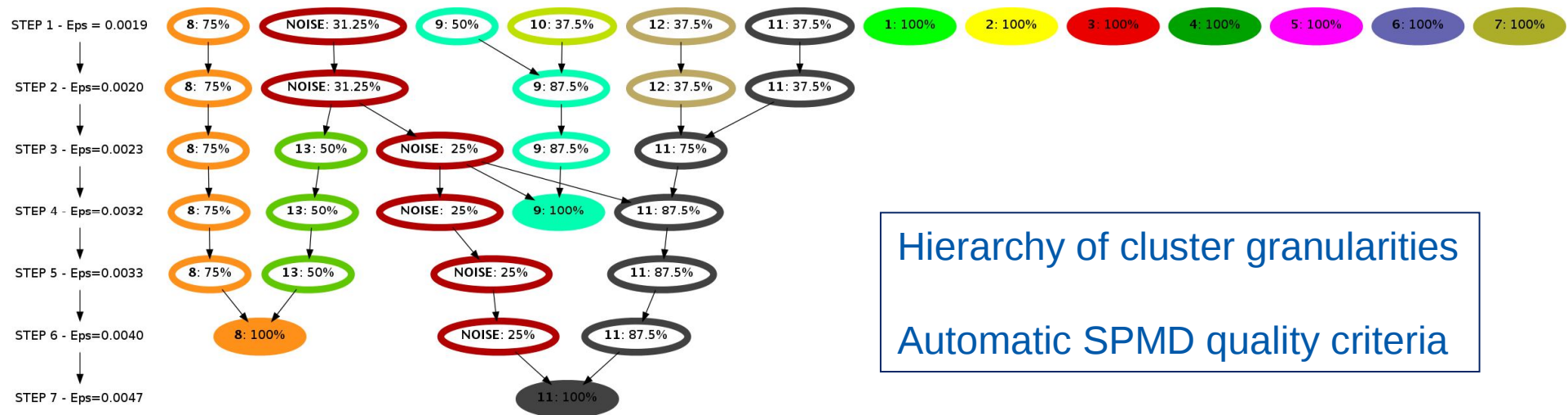
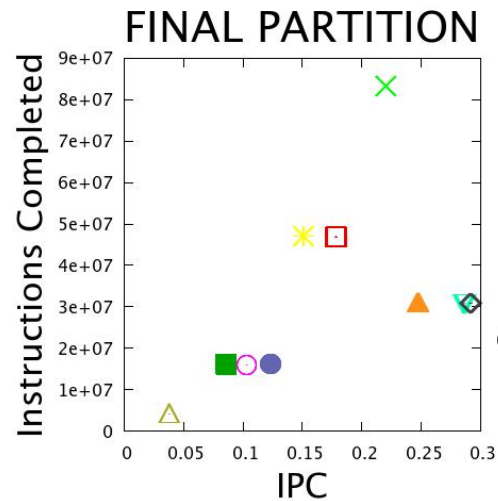


HydroC

Hardware counters projection



Quality driven clustering algorithms



Hierarchy of cluster granularities

Automatic SPMD quality criteria

Conclusions

- « Performance analytics: Data analytics applied to raw performance data
 - From data to insight, huge room for research
- « Clustering enables focusing the analysis and opens many different uses
 - Correlation of sampled data to generate instantaneous metric evolution
 - Separate speed factors per cluster on predictive simulations with Dimemas
 - Track application evolution using the clustering scatter plots

www.bsc.es/paraver