

Methods and Tools for Energy Optimization

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PLASMA and MAGMA Software Scope

symmetric positive definite

Cholesky

symmetric, hermitian

LDL^t

non-symmetric

$$Ax = b$$

LU

overdetermined

QR

underdetermined

symmetric positive definite

symmetric eigen-solver

symmetric, hermitian

$$Ax = b$$

general eigen-solver

non-symmetric

overdetermined

SVD

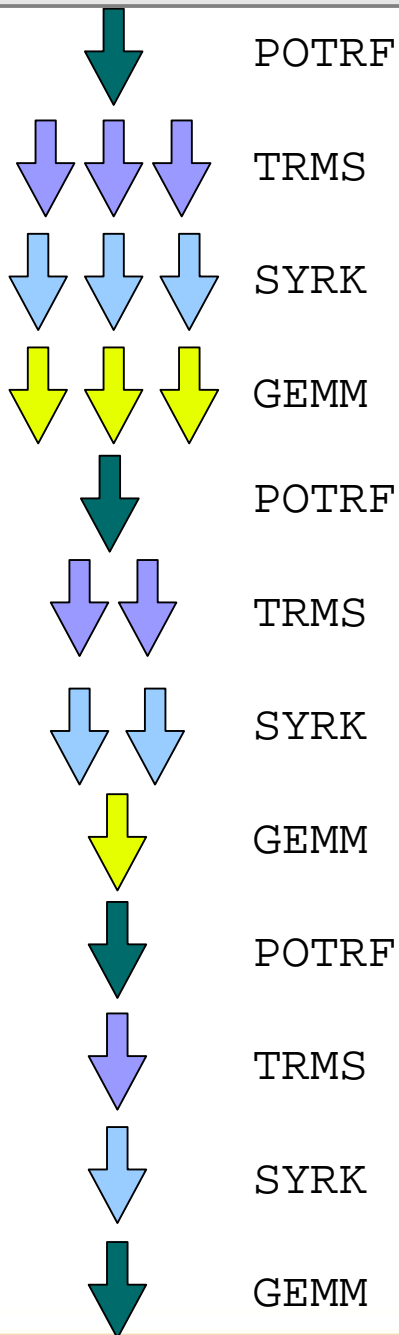
underdetermined

generalized

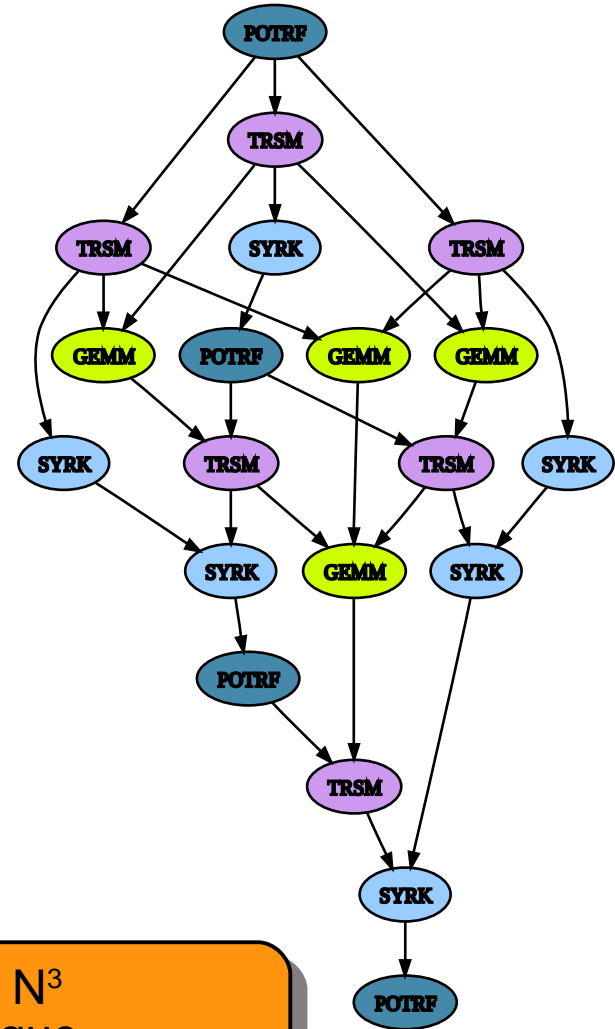
$$Ax = Bb$$

Cholesky +
symmetric eigen-solver

BSP (fork-join) vs. DAG (dynamically scheduled)

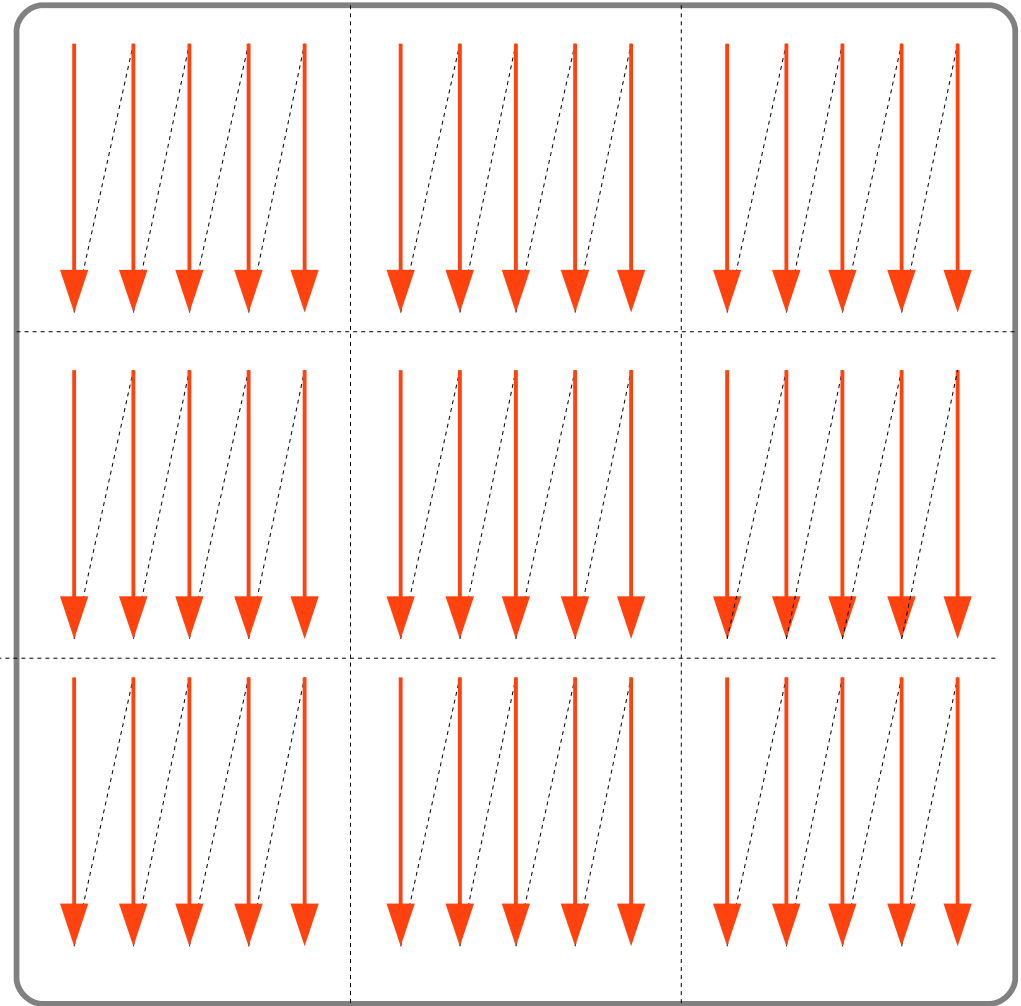
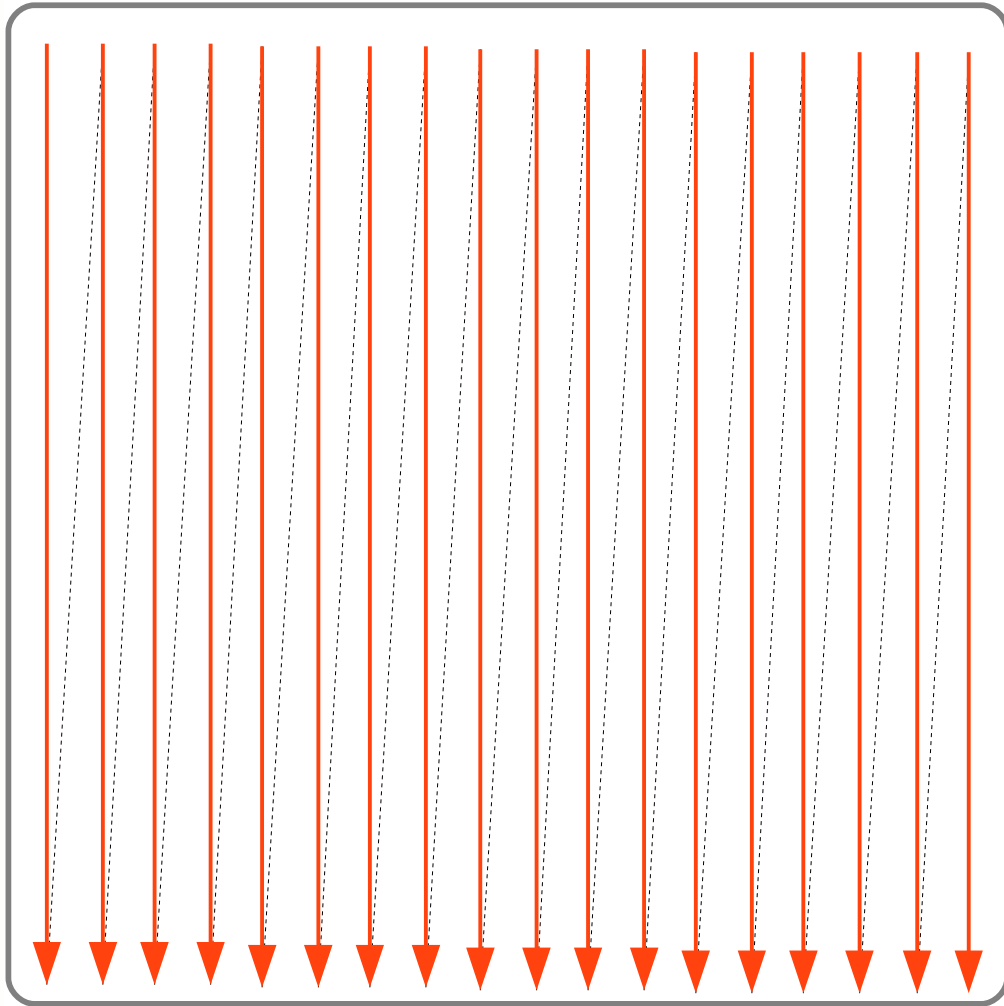


Cholesky factorization
 Problem size: 4 by 4



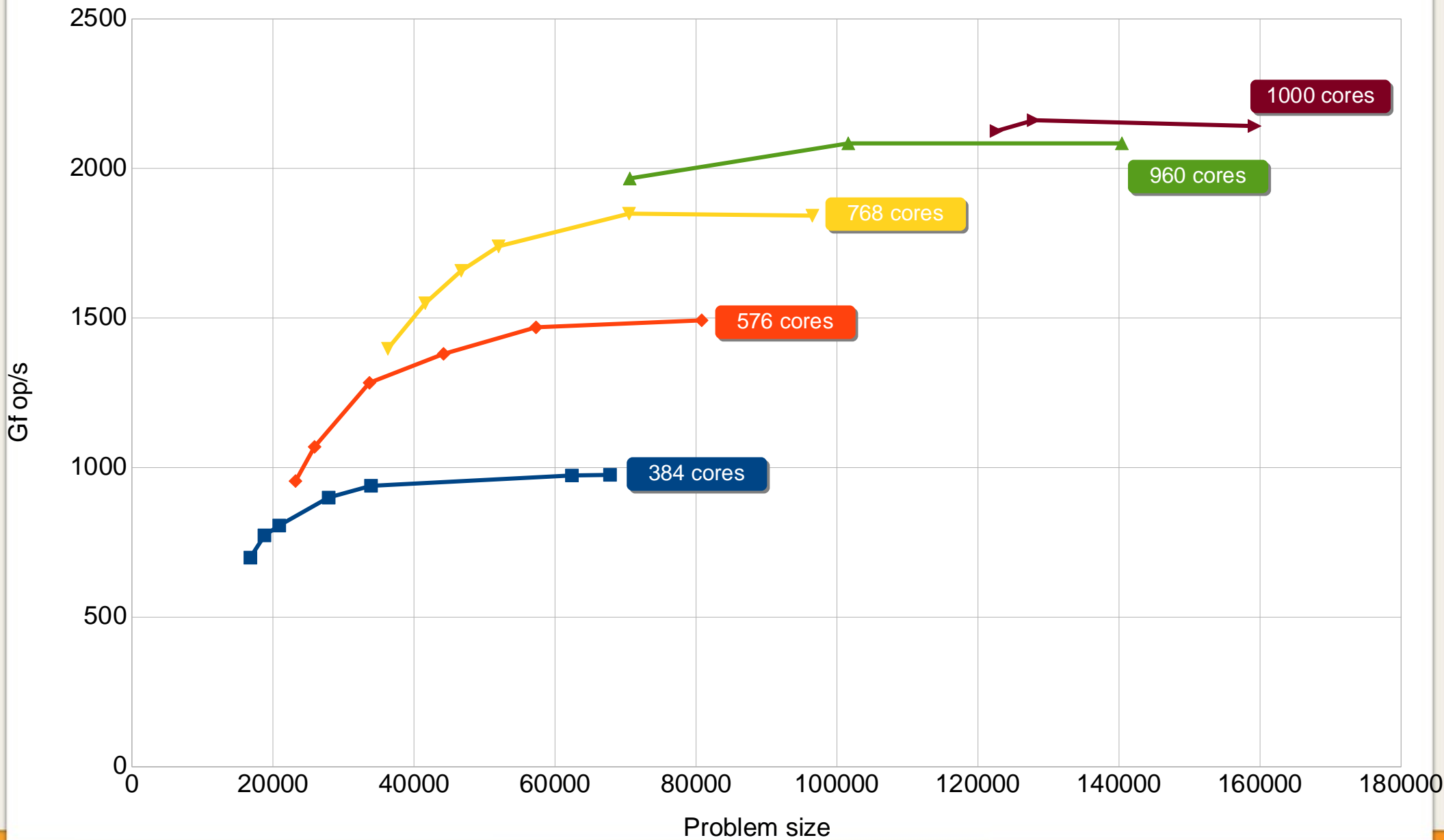
- DAGs get big quickly: N^3
- Sliding window technique
- DAGs are composed at runtime

Column-major (LAPACK) vs. Tile Storage (PLASMA)

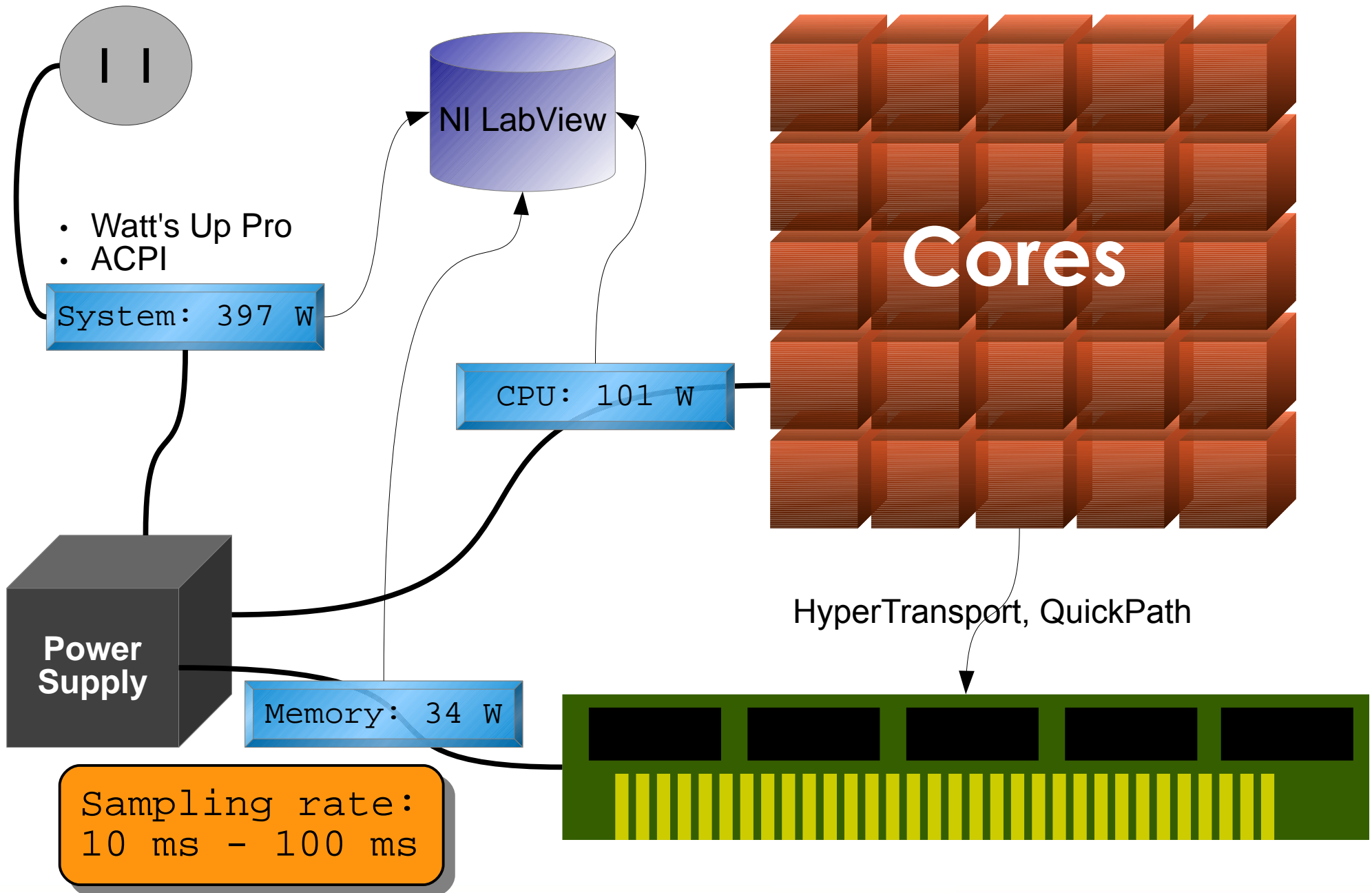


Solving Symmetric Positive Definite Systems (DPOSV)

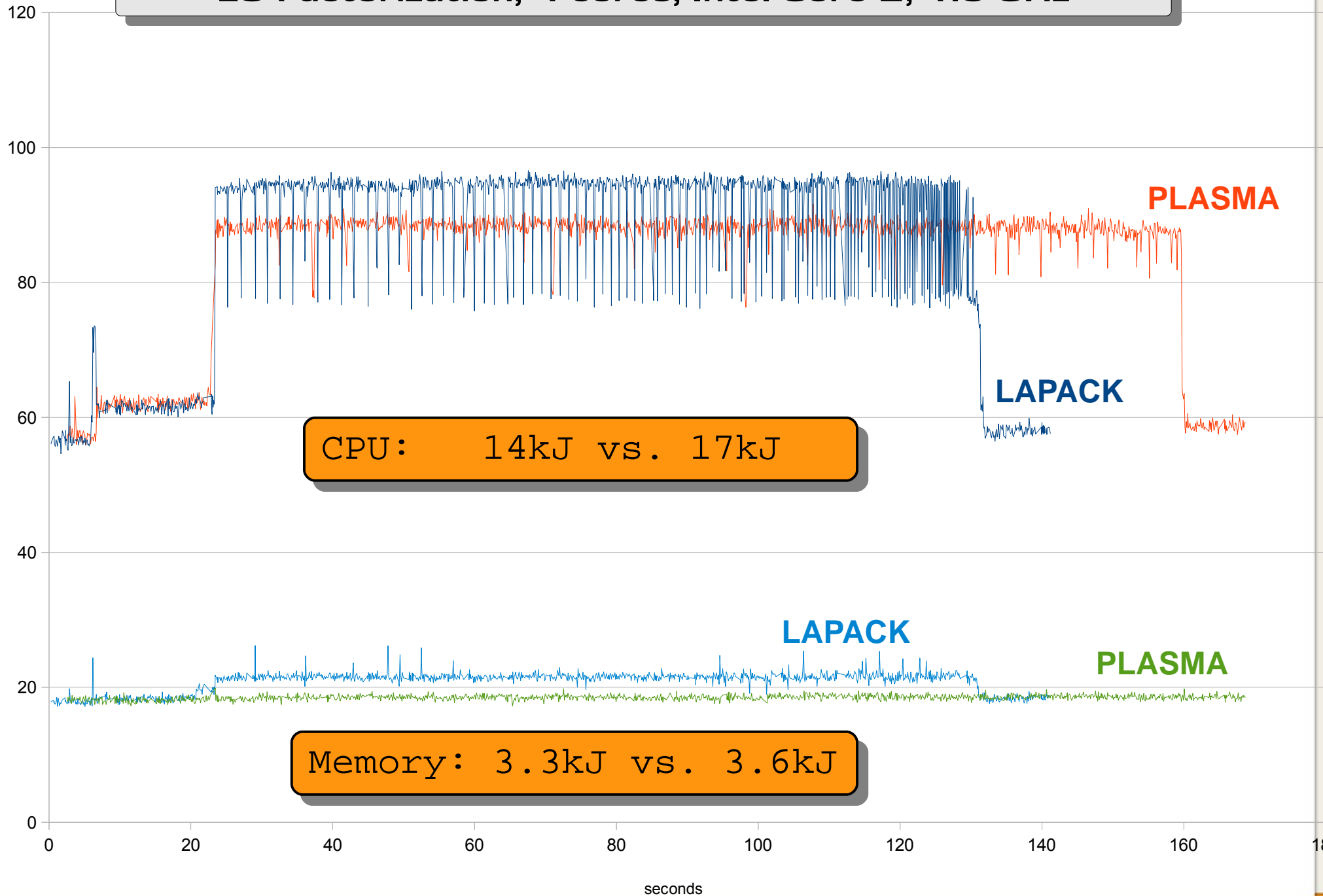
SGI Altix UV, 2.0 GHz Intel Nehalem EX



Monitoring Power and Energy with PowerPack



LU Factorization, 4 cores, Intel Core 2, 1.6 GHz



Memory: 3.3kJ vs. 3.6kJ

Power and Energy Metrics

- **Hardware inspired metrics**

- **Total power**

- **Energy delay product**

- **Power delay product**

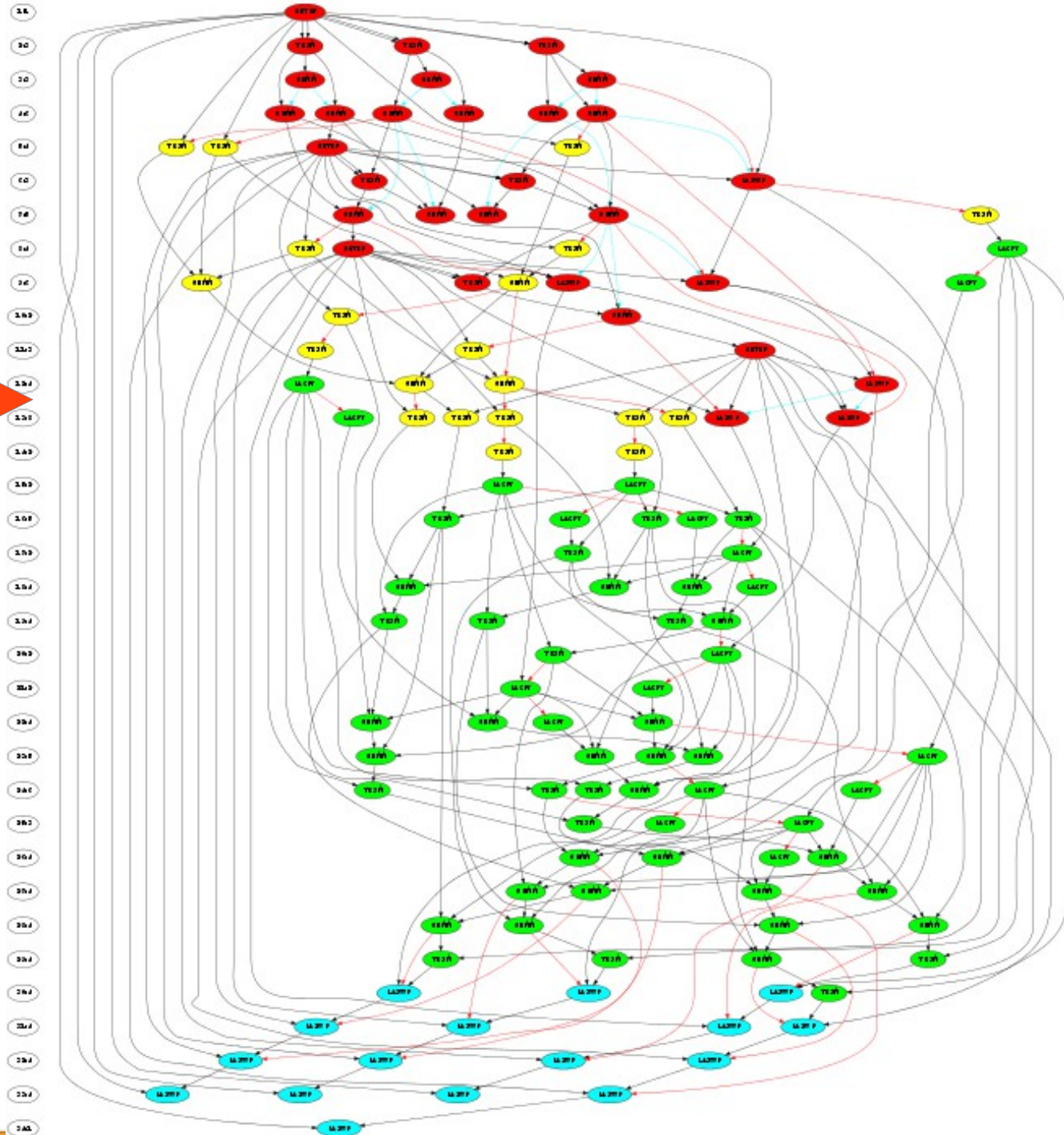
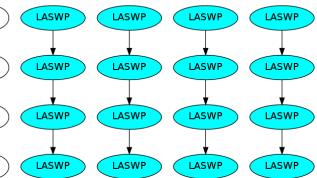
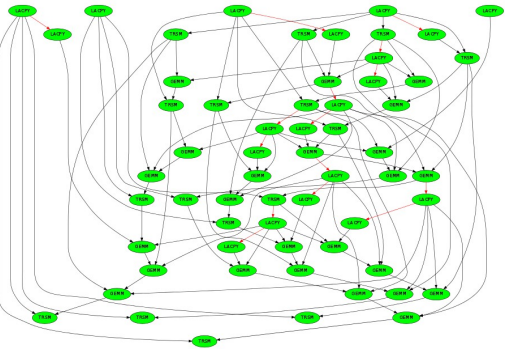
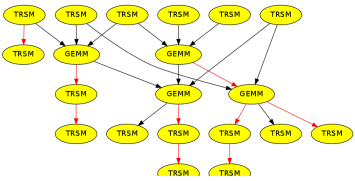
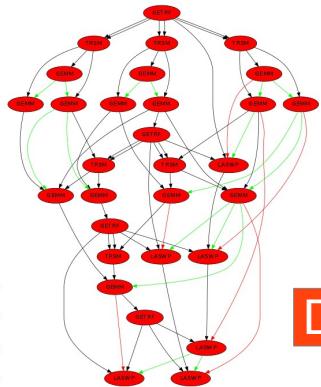
- $1 / (\text{Power} * \text{delay}) = 1 / (\text{Power} / \text{perf}) = \text{perf} / \text{Power}$ [Gflop/s per Watt]

- **Benchmarks**

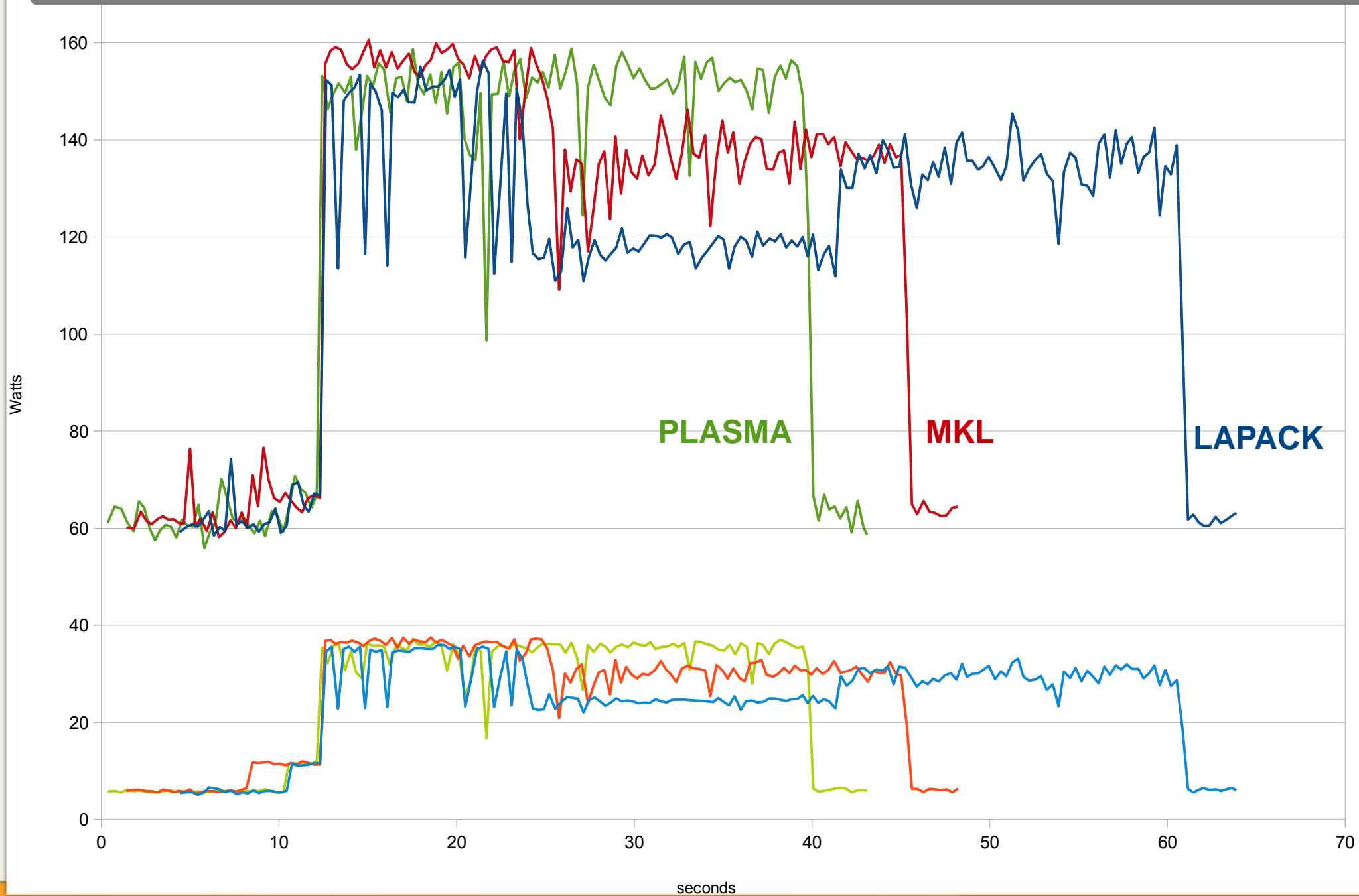
Rank	Name	TOP500	Green500	Power	Hours	M W h	Mil. Cores	MiB/core
1	Sequoia	16.3	2069	7890	23.1	182	1.57	780
2	K Comp	10.5	830	12660	29.5	373	0.71	1525
5	Tianhe-1	2.6	635	4040	3.4	14	0.19	531
6	Jaguar	1.9	377	5142	24.2	124	0.31	972
160	JAXA	0.1	119	1020	55.3	56	0.01	6942

LU-based Inversion 8-cores, 2.8 GHz

DAG Composition



LU-based Inversion, Intel Core 2, 8-cores, 2.8 GHz



Tool Support for Power and Energy Measurement

Hardware-based solutions

PowerPack

PowerScope

Energy Endoscope

Counter-based solutions

PAPI-C

Intel RAPL

NVIDIA NVML

VMware

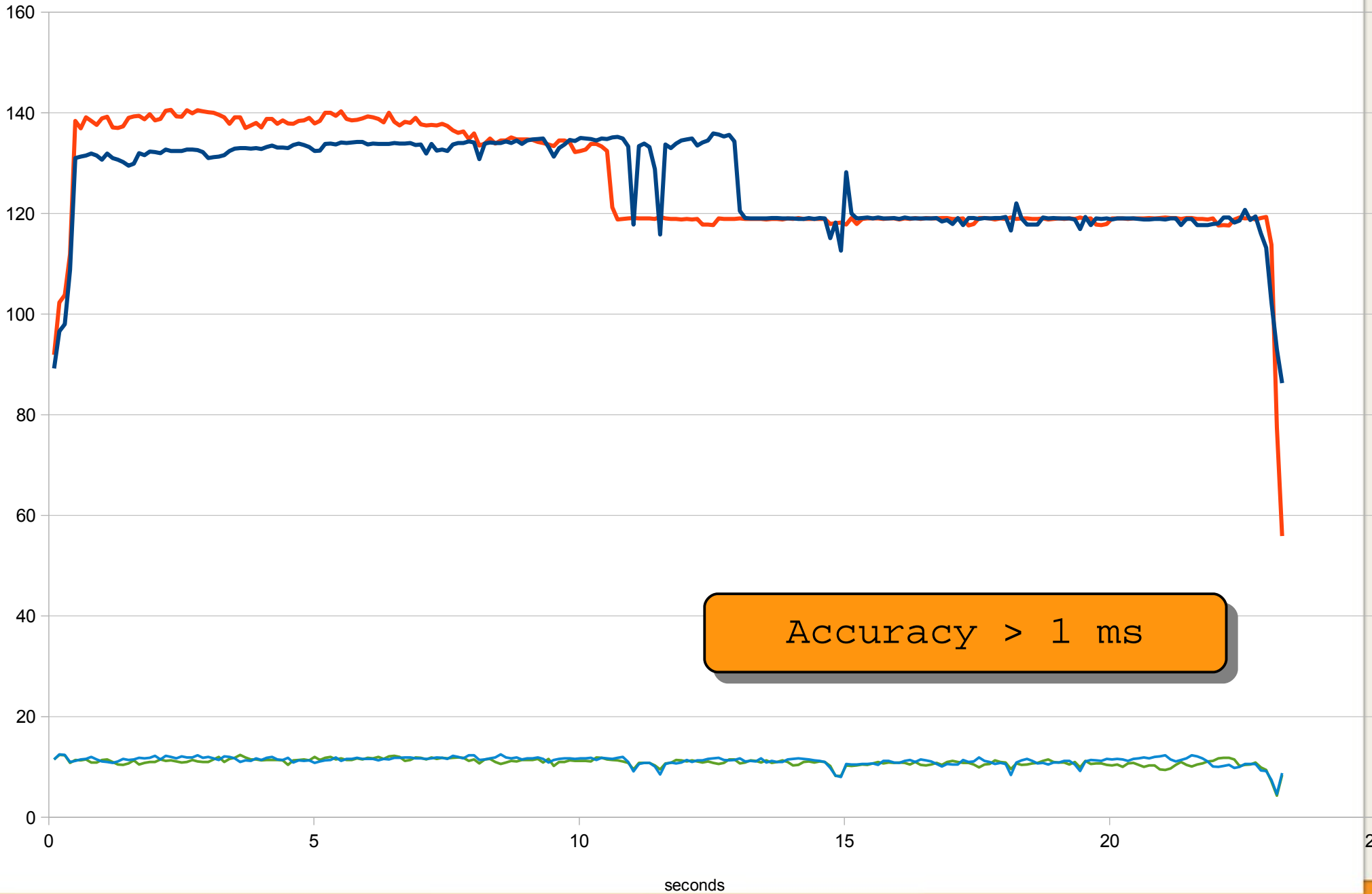
I/O

KVM

InifiniBand

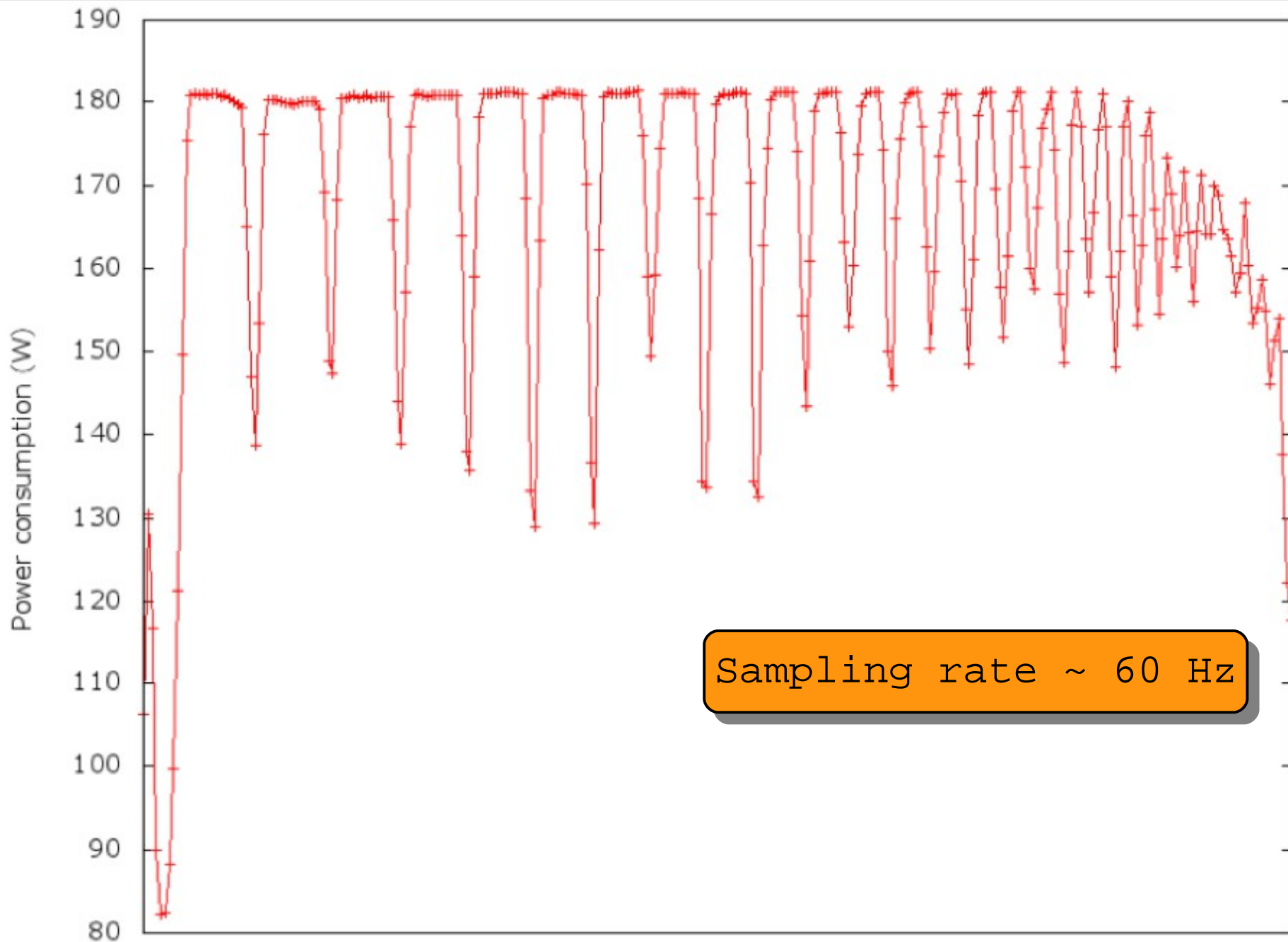
LM

Cholesky Solve, Intel Sandy-Bridge E5-2690, 16-cores, 2.9 GHz



Accuracy > 1 ms

MAGMA Power Profile on Fermi C2075 with PAPI and NVML



Sampling rate ~ 60 Hz

Collaborators

- **Kirk Cameron, Virginia Tech**
- **Jack Dongarra, University of Tennessee**
- **Hatem Ltaief, KAUST**
- **Mathieu Faverge, ENSEIRB-Matmeca, INRIA, Bordeaux, France**
- **Jakub Kurzak, University of Tennessee**
- **Stanimire Tomov, University of Tennessee**
- **Vince Weaver, University of Maine**