

# High Performance Geometric Multigrid: A Supercomputer Benchmark & Metric

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with

Jed Brown, John Shalf, Erich Strohmaier, Brian Van Straalen

#### **HPGMG** Project Design Goals

- General benchmarking efforts and provide compact benchmark codes to aid engineers & centers to design & deploy well balanced machines
  - Benchmark code with sensitivities to machine metrics that correlate well with applications
    - Presented some data from LLNL at ISC '14
- 2. HPGMG-FV: Supercomputer ranking metric
  - A specification and packaging built from Sam's finite volume code base



#### HPGMG-FV design

- Compact stand alone: C + MPI (+OMP, CUDA)
- Conceptually simple: solve Ax = b with multigrid
- Finite Volume, 3D non-constant coef. Laplacian
- Non-iterative (full) geometric multigrid solver
- Metric: equations (N) solved / sec
  - Map to flops/sec: 1200N (not exact nor well defined)
    - HPL uses 2N<sup>3</sup> map



#### Stable HPGMG-FV metric

- This year transitioned to 4<sup>th</sup> order accurate discretization
- First "official" 4<sup>th</sup> order list, stable specification
- Sensitive to more machine parameters than 2<sup>nd</sup> order:
  - 1. MPI message rates: 3x messages/op-apply
  - 2. MPI bandwidth: 2x message sizes (two ghost cell layers)
  - 3. More pressure on cache: ~2x working set size
  - 4. Large stencil, many data streams
  - 5. Wide range of message sizes: coarse grids are smaller
  - 6. Full MG: more small messages (more coarse grid visits)
- More floating point intensive (flop/byte ~1)
  - With respect to "book-end" strategy of HPL-HPCG
    - We try to be in the middle



#### Maintainable, durable (+ dynamic range)

- Experience TOP500, HPL, other benchmarking initiatives
  - Simplicity key
- Need unambiguous specification
  - Can not afford to micro-manage or adjudicate each submission
- Dynamic range, or strong scaling, important to applications
  - But Constraints interfere with incorporating dynamic range in metric

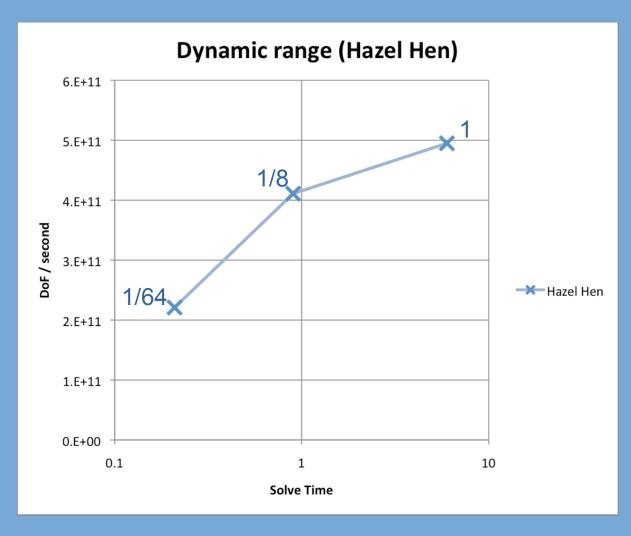
Criterion	HPGMG-FV	HPL	HPCG
Architecture Free	<b>✓</b>	<b>V</b>	Minimum 25% "main memory" usage
Scale/PM Free	✓	<b>V</b>	Gauss-Seidel only on "sub domains"
Math/algorithm fully specified	<b>✓</b>	✓ (!Str)	Vertex order not specified for G-S, affects convergence, affects metric
Dynamic range	<u>1</u> , 1/8, 1/64	R <sub>1/2</sub>	



### HPGMG-FV ranking, June '16

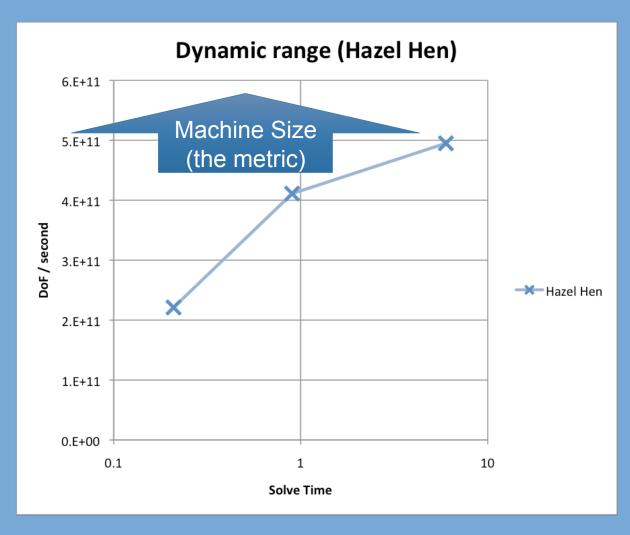
#	Site	Sys	Arch	10 <sup>9</sup>	DOF 1/8	Se 1/64	MPI *the	OMP metric	#GPU	# HPL	#HP CG
1	DOE/ ANL/USA	Mira	IB′ (- P ∂Q	<u>500</u>	313	107	9K	64	0	6	~6
		Mira	ase	395	286	107	45 (	64	0		
2	HLRS/ Germany	Hazel Hen	Cray KC40	<u>495</u>	411	221	15	12	0	9	~7
3	DOE/ ORNL/US	Titan	Cray KK7	<u>440</u>	163	39	161	4	1	3	~4
4	KAUST/ SA	Sha. II	Cray CC40	<u>326</u>	287	175	12	16	0	10	~10
5	DOE/ NER/USA	Edison	Cray Xu 30	<u>296</u>	246	127	1 K	12	0	49	~16
6	CSCS Swiss	Piz Daint	Cra XC3L	<u>153</u>	69	19	4K	8	1	8	~9
8	HLRS/G	NEC	SX- AC	3.2	1.8	5	256	1	0	-	-

ISC, Frankfurt Germany, 21 June 2016



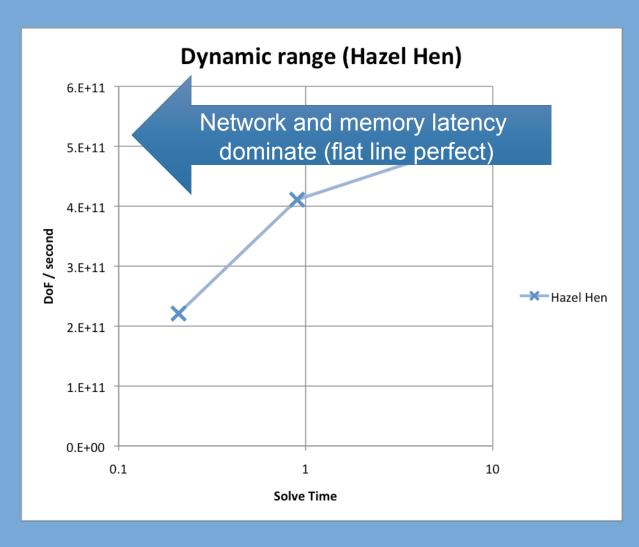
- Dynamic range:
  - Same concurrency
  - Reduce problem size
  - Flat lines perfect
- Strong scaling:
  - Same problem size
  - Increase concurrency
- Weak scaling:
  - Increase both





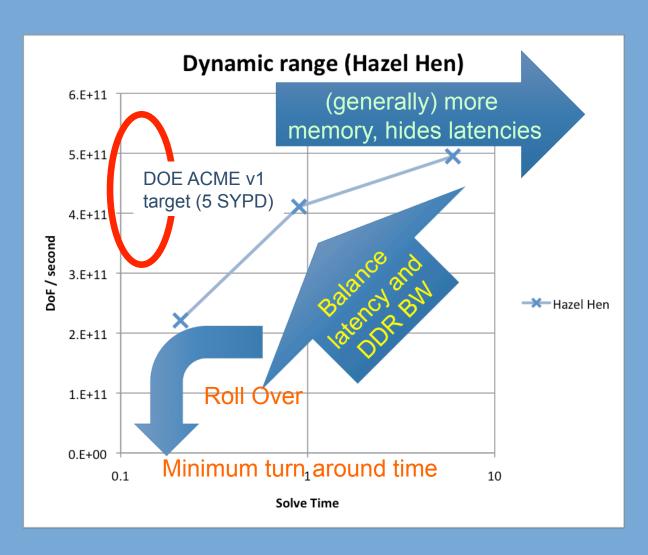
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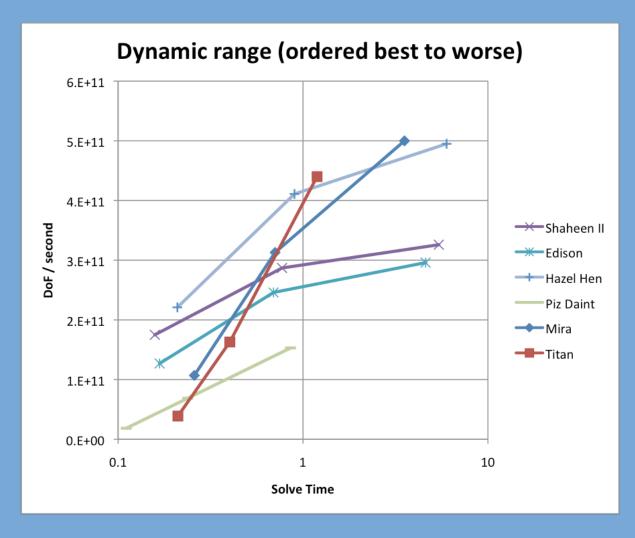
- Dynamic range:
  - Same concurrency
  - Reduce problem size
  - Flat lines perfect
- Strong scaling:
  - Same problem size
  - Increase concurrency
- Weak scaling:
  - Increase both





- STREAM proxy (usually)On right
- Balance of latencies to memory capacity
- Roll-overOn left





- Dynamic range:
  - Sameconcurrency
  - Reduce problem size
- Strong scaling:
  - Same problem size
  - Increase concurrency
- Weak scaling:
  - Increase both



### Consider a dynamic range metric

- Consider the sum for the three data points (dof/sec) and not the maximum
  - Convergent series, will roll over eventually

1. Hazel Hen 1130 (x109 dof/second)

2. Mira 920

3. Shaheen II 788

4. Edison 669

5. Titan 642

6. Piz Daint 240



#### Community buy-in & related efforts

- 1. Vendor buy-in
  - Nvidia optimized 2nd & 4th order for Kepler & Pascal
    - MPI + OpenMP + CUDA
  - Intel recently started KNL optimizing (Sam already started)
- 2. Sam Williams' GMG codes used in several efforts
  - HPGMG-FV is the ranking metric instantiation ....
  - DOE FastForward2: selected as a 1/6 proxy apps
  - DOE DEGAS project:
    - investigated one-sided UPC++ implementations
    - PYGMG (python version HPGMG) with
    - SEJITS (selective just in time specialization)
  - DOE DTEC project: Halide stencil DSL of GMG
  - DOE Traleika Glacier project (Intel)
    - OCR dynamic task runtime (3 versions, low to higher level)
  - Other groups:
    - UCB, MIT, Rice, ORNL, SDSC, Riken, HLRS, KAUST, NREL



### Submissions SC16 (hpgmg.org)

- Welcome submissions, collaborations & questions
  - Contact <a href="mailto:hpgmg-forum@hpgmg.org">hpgmg.org</a>
  - Visit <u>hpgmg.org</u>
  - Submission instructions: <a href="https://prescription.org/fv">hpgmg.org/fv</a>
- Next list release at SC16 BoF, more architectures:
  - Accelerators: TH-2A, ...
  - Cluster of commodity processors, infiniband
    - SuperMUC (all 17 islands, only have data with 4), ...
  - K: want full scale 4<sup>th</sup> order data and G-S optimization
  - More, THL ...
- Our repositories
  - OpenMP: <u>bitbucket.org/hpgmg/hpgmg</u>
  - CUDA: <u>bitbucket.org/nsakharnykh/hpgmg-cuda</u>



### Thank you





https://hpgmg.org/

https://bitbucket.org/hpgmg/hpgmg

Mark Adams

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Sam Williams



# .... More back ground

4 architectures on list



### 1) Nvidia GPUs

#	Site	Systm	Arch.	10 <sup>9</sup> x h*	DOF/ 2h	sec 4h	<u>MPI</u>	<u>OMP</u>	<u>GPU</u>	HPL rank
1	DOE/ANL/ USA	Mira	IBM- BGQ	<u>500</u>	313	107	49K	64	0	5
				395	286	107	49K			
2				<u>495</u>	411	221	15K			8
3	DOE/ ORNL/US	Titan	Cray XK7	<u>440</u>	163	39	16K	4	1	2
4				326	287	<u>175</u>	12K			9
5				<u>296</u>	246	127	11K			40
6	CSCS Swiss	Piz Daint	Cray XC30	<u>153</u>	69	19	4K	8	1	7
8	HLRS/ Germany	NEC	SX- ACE	3.3 * The furt Germ	1.8 <i>metric</i> any, 21 Jui	. <b>75</b> ne 2016	256	1	0	-

### 2) Light-weight in-order cores

#	Site	Systm	Arch.	10 <sup>9</sup> x h*	DOF/ 2h	sec 4h	MPI	<u>OMP</u>	<u>GPU</u>	HPL rank
1	DOE/ANL/ USA	Mira	IBM- BGQ	<u>500</u>	313	107	49K	64	0	5
		Mira	(Base)	395	286	107	49K	64	0	
2				<u>495</u>	411	221				8
3				<u>440</u>	163	39				2
4				326	287	<u>175</u>				9
5				<u>296</u>	246	127				40
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8	HLRS/ Germany	NEC	SX- ACE	3.3 * <i>The</i> furt Germ	1.8 <i>metric</i> any, 21 Jul	.75 ne 2016	256	1	0	-

### 3) Cray – Xeon processors

#	Site	Systm	Arch.	10 <sup>9</sup> x h*	DOF/ 2h	sec 4h	<u>MPI</u>	<u>OMP</u>	<u>GPU</u>	HPL rank
1	DOE/ANL/ USA	Mira	IBM- BGQ	<u>500</u>	313	107	49K	64	0	5
				395	286	107				
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### 4) NEC vector architecture

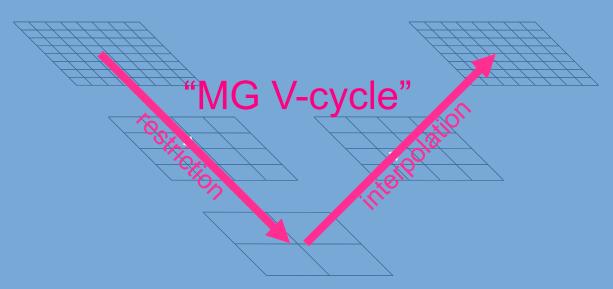
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### Dynamic range, DDR BW, cache size

#	Site	Systm	Arch.	10 <sup>9</sup> x h*	DOF/ 2h	sec 4h	<u>MPI</u>	<u>OMP</u>	<u>GPU</u>	HPL rank
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				395	286	107				
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### Geometric Multigrid

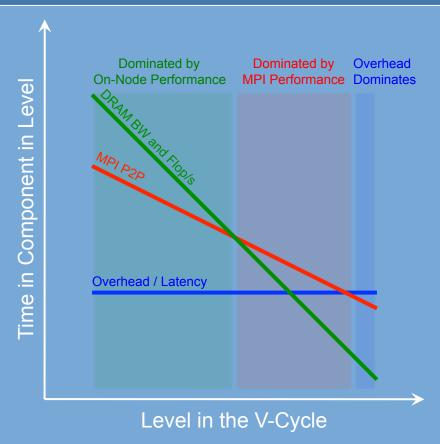
- Extremely fast/efficient....
  - O(N) computational complexity (#flops)
  - O(N) DRAM data movement (#bytes)
  - O(N<sup>0.66</sup>) MPI data movement





#### Ideal Performance

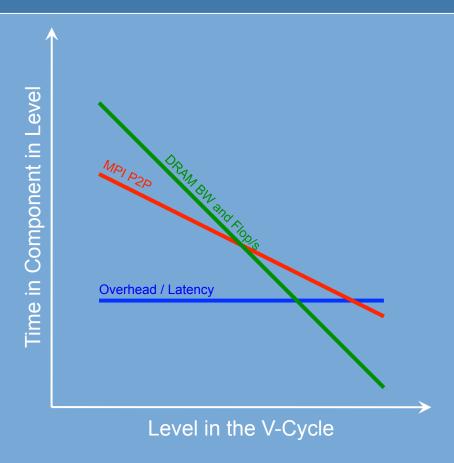
- Nominally, multigrid has three components that affect performance
  - DRAM data movement and flop's to perform each stencil
  - MPI data movement for halo/ ghost zone exchanges
  - latency/overhead for each operation (MPI when it matters)
- These are constrained by
  - DRAM and flop rates
  - MPI P2P Bandwidth
  - MPI overhead, OpenMP/CUDA overheads, etc...
- The time spent in each of these varies with level in the v-cycle
  - coarse grids have ½ the volume (number of cells), but ¼ the surface area (MPI message size)





#### **Faster Machines?**

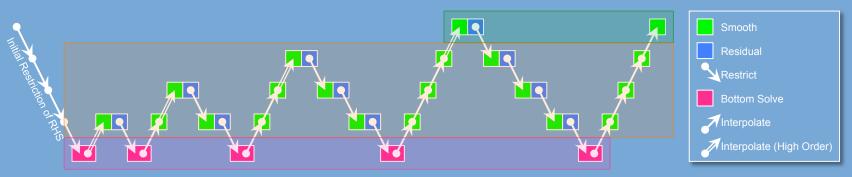
- If one just increases DRAM bandwidth by 10x, then the code becomes increasingly dominated by MPI P2P communication
- If one improves just DRAM and MPI bandwidth, the code will eventually be dominated by CUDA, OpenMP, and MPI overheads.
- Unfortunately, the overheads are hit O(logN) times.
- Thus, if overhead dominates (flops and bytes are free), then MGSolve Time looks like O(logN)
- Co-Design for MG requires a balanced scaling of flop/s, GB/s, memory capacities, and overheads





#### **FMG**

- HPGMG-FV implements Full Multigrid (FMG).
- FMG uses an F-Cycle with a V-Cycle at each level.
- No iterating. One global reduction (to calculate the final residual)
- Essentially, an O(N) direct solver (discretization error in 1 pass)



- Fine grids (those in slow "capacity" memory) are accessed only twice
- Coarser grids (those that have progressively smaller working sets) are accessed progressively more
- Same routines are used many times with highly varied working sets
- Coarsest grids are likely latency-limited (run on host?)
- FMG sends O(log²(P)) messages (needs low overhead communication)
- Stresses many aspect of the system (memory hierarchy, network, compute, threading overheads, heterogeneity, ...)

### HPGMG-FV detailed timing....

			Time with	in-a-MG						Total-1	Time by
			level by fu	inction							unction
box dimension	0 128^3	1 64^3	2 32^3	3 16^3	4 8^3	5 8^3	6 8^3	7 4^3		9 <sup>7 -</sup> 9^3	total
smooth		0.009769	0.002024	0.000753	0.000592	0.000711	0.000833	0.001602		 0.000000	0.100826
residual	0.018734	0.000940	0.000204	0.000088	0.000073	0.000087	0.000102	0.000181	0.000158	0.000155	0.020721
apply0p Smoo	otn on <sub>d</sub> tines	t level <sub>l</sub> is	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.001907	0.001907
BLAS1	280/00f COL	Ve 412115	0.000057	0.000053	0.000064	0.000069	0.000082	0.000206	0.000197	0.014692	0.019984
BLAS3	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000
Boundary Conditions	0.00 <mark>0</mark> 000	0.000308	0.000080	0.000017	0.000005	0.000005	0.000005	0.000013	0.000014	0.000011	0.000458
Restriction	0.000922	0.000350	0.000297	0.000141	0.000435	0.000363	0.000445	0.000603	0.000790	0.000000	0.004346
local restriction	0.000915	0.000342	0.000288	0.000130	0.000032	0.000037	0.000042	0.000129	0.000146	0.000000	0.002062
pack MPI buffers	0.000001	0.000001	0.000000	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.000000	0.000007
unpack MPI buffers	0.000001	0.000001	0.000001	0.000001	0.000095	0.000106	0.000124	0.000140	0.000224	0.000000	0.000694
MPI_Isend	0.000001	0.000000	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.000000	0.000007
MPI_Irecv MPI_Waitall	0.00 <mark>0</mark> 001 0.000000	0.000001 0.000001	0.000001 0.000001	0.000001 0.000001	0.000035 0.000263	0.000045 0.000164	0.000061 0.000205	0.000056 0.000263	0.000063 0.000340	0.000000 0.000000	0.000263 0.001239
Interpolation	0.002921	0.001742	0.001107	0.000369	0.000499	0.000579	0.000741	0.000631	0.000740	0.000000	0.001239
local interpolation	0.002916	0.001742	0.001107	0.000358	0.000499	0.000077	0.000085	0.000137	0.000147	0.000000	0.006621
pack MPI buffers	0.000000	0.000000	0.000001	0.000001	0.000157	0.000179	0.000202	0.000137	0.000238	0.000000	0.000021
unpack MPI buffers	0.000000	0.000000	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.0000002	0.000000	0.000009
MPI_Isend	0.000000	0.000000	0.000001	0.000001	0.000131	0.000154	0.000196	0.000154	0.000185	0.000000	0.000822
MPI_Irecv	0.000000	0.000000	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.000001	0.000000	0.000007
Time in an operation		0.000001	0.000001	0.000001	0.000132	0.000155	0.000241	0.000176	0.000150	0.000000	0.000856
Ghost Zone Exchange	0.010486	0.005997	0.003671	0.003480	0.003963	0.004767	0.005602	0.007449	0.007796	0.002098	0.055309
local exchange	0.000003	0.000003	0.000004	0.000005	0.000006	0.000007	0.000008	0.001059	0.001659	0.001838	0.004589
pack MPI buffers	0.001327	0.000467	0.000442	0.000518	0.000624	0.000743	0.000863	0.000991	0.001208	0.000026	0.007210
unpack MPI buffers	0.00047 <mark>3</mark>	0.000455	0.000485	0.000593	0.000738	0.000878	0.001019	0.001130	0.001331	0.000025	0.007125
MPI_Isend	0.000302	0.000339	0.000450	0.000781	0.000937	0.001143	0.001334	0.001515	0.001190	0.000018	0.008009
MPI_Irecv	0.00009 <mark>8</mark>	0.000096	0.000140	0.000165	0.000210	0.000250	0.000299	0.000313	0.000257	0.000012	0.001835
MPI_Waitall	0.008260	0.004603	0.002103	0.001355	0.001370	0.001656	0.001970	0.002306	0.002008	0.000011	0.025641
MPI_collectives	0.001312	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.000000	0.002378	0.003691
Total by level	0.122319	0.018799	0.007384	0.004927	0.005706	0.006680	0.008064	0.010724	0.010967	0.021933	0.217503
Total time in MGBuild	225.675795 s	aconds									
Total time in MGSolve number of v-cycles		MPI_Co									
Bottom solver iterations	70										
Performance	4.489e+11 D	0F/s									
			Used to v	erify imp	lementatio	on					
calculating error			error sho	ould be 2 <sup>nd</sup>							
h = 2.170138888888889e-	04   error   =	4.59512224	8560908e-11								



## How sensitive is exascale to operations with limited parallelism?

- MG's computational complexity is premised on the assumption that N/8 flops requires N/8 time.
  - N+N/8+N/64... = O(N) flops  $\sim O(N)$  time
- Today, the performance of MIC/GPU processors decreases substantially when parallelism falls below a certain threshold (underutilization)
- If time ceases to be tied to N but saturates at some constant, then
  - $N+N/8+N/8+N/8+...N/8 \sim O(Nlog(N))$
- Does your FastForward processor performance on coarse (coasrer) grids impede overall multigrid performance?
  - Are there architectural features you can exploit to avoid this?
  - If so, how do you succinctly specialize code to exploit them?
     (i.e. do we really have to write every routine twice?)
  - Are there other approaches to ensure coarse grid operations are not a bottleneck?



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#### Memory Capacity Issues

- In AMR MG Combustion codes, you need a separate field/component/vector for each chemical species (NH<sub>4</sub>, CO<sub>2</sub>, ...) on each AMR level
- As such, given today's memory constraints, the size of each process's subdomain might be small (643...1283)
- Future machines may have 10x more memory than today's...
  - 100GB of fast memory
  - 1TB of slow memory
- Why not run larger problems to amortize inefficiencies?
  - Application scientists would prefer to use it for new physics or chemistry.
     e.g. increase the number of chemical species from 20 to 100
  - AMR codes could use the memory selectively (where needed) with deeper AMR hierarchies.
  - The memory hierarchy can be used to prioritize the active working set...
     e.g. fit the MG solve on current species of the current AMR level in fast memory
- If performance is not feasible, we need to know soon as significant changes to LMC would be required to increase on-node parallelism



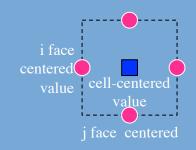
#### Choice of Smoother

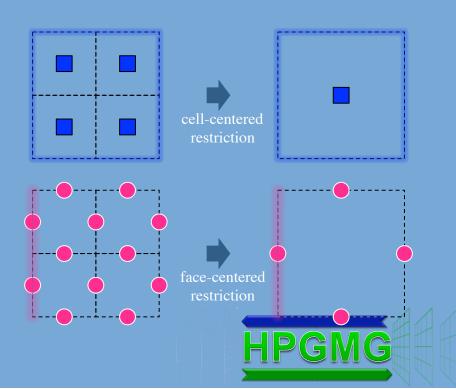
- In the manycore era, the choice of smoother:
  - must balance mathematical (convergence) and architectural constraints (TLP/SIMD/BW).
  - may see up to a 100x performance hit without threading on a Xeon Phi (MIC)
- Using HPGMG-FV we observed differences in performance among smoothers...
  - GSRB and w-Jacobi were the easiest to use
  - SYMGS required fewer total smooths, but its performance per smooth was very poor.
  - Based on Rob/Ulrike's paper, L1 Jacobi was made as fast as w-Jacobi
  - Chebyshev was fastest in the net (smooth was little slower, but required fewer smooths)
  - Unfortunately, Chebyshev is a bit twitchy as it needs eigenvalue estimates.

	SYMGS (blocked)	Gauss-Seidel Red-Black	Chebyshev Polynomial	weighted Jacobi	L1 Jacobi
Convergence	very good (2 SYMGS)	good (2-3 GSRB)	very good Degree 2 or 4	slow (8+ smooths)	slow (8+ smooths)
Requirements (in addition to D-1)		N/A to high-order operators	spectral properties of the operator	not necessarily stable	L1 norm
Threading?	extremely difficult	yes	yes	yes	yes
SIMD?	extremely difficult	inefficient (stride-2)	yes	yes	ves

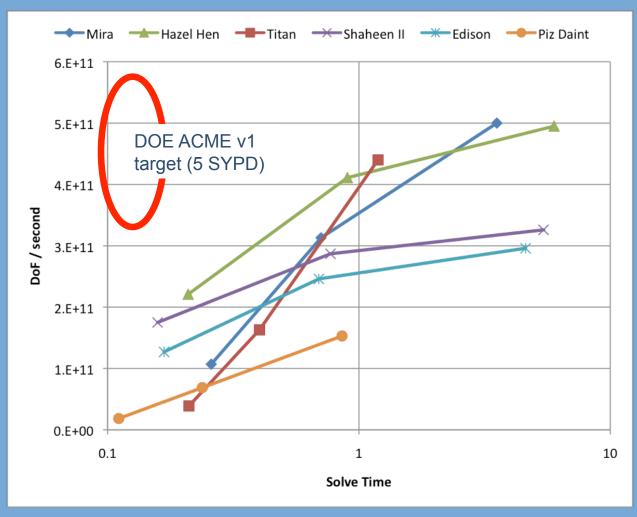
#### Cell-Centered MG

- Values can represent...
  - cell averages (cell-centered)
  - face averages (face-centered)
- Restriction/Prolongation can be either cell- or face-centered.
- In piecewise constant restriction, coarse grid elements are the average value of the region covered by fine grid elements
- Solutions variables are usually cellcentered, but boundary values exist on cell faces (face-centered)
  - enforcing a homogeneous Dirichlet boundary condition is not simply forcing the ghost cells to zero.
  - Rather one has to select a value for each ghost cell that allows one to interpolate to zero on the face.





### Strong scaling: DoF/sec vs Time



- Turn around time
- Flat lines= perfectstrongscaling

