## Autotuning multigrid parameters in the HMC on different architectures

#### Marco Garofalo, <u>Bartosz Kostrzewa</u>, Simone Romiti, Aniket Sen

Rheinische Friedrich-Wilhelms-Universität Bonn

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improvements over the last 18 months



• tmLQCD: ETMC workhorse HMC implementation for  $N_f = 2 + 1 + 1$  twisted mass Wilson (clover) simulations



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### $112^3 \cdot 224$ at $M_\pi^{\text{phys}}$ (LUMI-G)



#### LUMI-G (MI250) strong scaling



## MG solver in the light sector



Comparison between MG-preconditioned-GCR mixed-precision CG (GPU) MG timing: two inversions + unavoidable overheads from coarse operator updates between D and D<sup>†</sup> inversions

#### Light sector of MD Hamiltonian

In practice we employ

- 2 to 3  $\rho$ -shifts (shifting the EO-operator)
- 3-4 time scales
- $\rightarrow$  per trajectory need to solve systems with:
- $\rho = 0$  about  $\mathcal{O}(100)$  times  $\rightarrow$  MG
- $\rho \approx 0.001$  about  $\mathcal{O}(100)$  times  $\rightarrow$  MG
- $\rho \approx 0.01$  about  $\mathcal{O}(200)$  times  $\rightarrow \text{CG}$
- $\rho \approx 0.1$  about  $\mathcal{O}(400)$  times  $\rightarrow \text{CG}$

MG requires two solves in derivative and an update of the coarse operator (due to twisted mass sign change), but easily wins up to  $\rho \approx am_s$ .

## Moving MG parameters from one machine to another

- Late 2022 / early 2023
  - started production of  $112^3 \cdot 224$  physical point ensemble on LUMI-G (MI250)
- First computing time estimates based on performance on Juwels Booster (A100).
- Intermediate grid:  $56 \cdot 4 \cdot 4 \cdot 8$  per GPU
- Coarsest grid:  $8 \cdot 2 \cdot 2 \cdot 4$  per GPU
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parameter	Ivl 0	Ivl 1	lvl 2
mg-mu-factor	1.0	1.0	50.0
mg-coarse-solver-tol	0.1	0.1	0.1
mg-coarse-solver-maxiter	100	100	100
mg-nu-post	4	4	4
mg-nu-pre	2	2	2
mg-smoother-tol	0.1	0.1	0.1
mg-omega	0.9	0.9	0.9

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	-	~	2
mg-smoother-tol	0.1	0.1	0.1

Juwe	ls E	300	ster
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28 nodes:  $\sim$  6 seconds / solve

UMI-G	
18 nodes	
in 2023: $\sim$ 41 seconds / solve	

• today:  $\sim$  14 seconds / solve

## Origin of the performance difference?

QUDA coarse-grid operator benchmark (single precision, 24 colours)





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QUDA coarse-grid operator benchmark (single precision, 24 colours)



Maybe we can find a different balance between coarse, intermediate and fine iterations to obtain better performance on MI250?

#### Parameters that can be tuned w/out redoing MG setup

parameter	sensible choices
mg-mu-factor	$5 \cdot 5 \cdot 15 = 375$
mg-coarse-solver-tol	$4^2 = 16$
mg-coarse-solver-maxiter	$4^2 = 16$
mg-nu-post	$4^3 = 64$
mg-nu-pre	$4^3 = 64$
mg-smoother-tol	$3^3 = 9$
mg-omega	$3^3 = 9$
total	$pprox 10^{10}  m  combs$

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mg-nvec	$\approx 2^2 = 4$
total	pprox 36 combs

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Fully exhaustive search clearly not possible!

- fix certain params on certain levels
- do not tune less relevant params

• tune mostly / only on coarser levels Can restrict to relevant subset of  $\approx 10^6$  parameter combinations or so.

Still a major investment of computing time!

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• tune mostly / only on coarser levels Can restrict to relevant subset of  $\approx 10^6$  parameter combinations or so.

Still a major investment of computing time!

Can we we use our intuition to find good MG setups more quickly?

https://github.com/etmc/tmLQCD/tree/deriv\_mg\_tune

#### Ideas behind proceduce:

- Always start at coarsest grid.
- Tune most relevant params first.
- Ignore small fluctuations.

- Accept even small improvements (might need several steps to see benefit).
- Tune on multiple gauge configurations.

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parameter	Ivl O	Ivl 1	lvl 2
mg-mu-factor	$\mu_0$	$\mu_1$	$\mu_2$
mg-coarse-solver-tol	$r_0$	$r_1$	$r_2$
mg-coarse-solver-maxiter	$n_0$	$n_1$	$n_2$
mg-nu-post	$\nu_0^{\mathrm{post}}$	$\nu_1^{\rm post}$	$\nu_2^{post}$
mg-nu-pre	$\nu_0^{\mathrm{pre}}$	$\nu_1^{\rm pre}$	$\nu_2^{\mathrm{pre}}$
mg-smoother-tol	$r_0^s$	$r_1^s$	$r_2^s$
mg-omega	$\omega_0$	$\omega_1$	$\omega_2$

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#### • How to deal with non-converging solves?

parameter	Ivl 0	Ivl 1	Ivl 2
mg-mu-factor	$\mu_0$	$\mu_1$	$\mu_2$
mg-coarse-solver-tol	$r_0$	$r_1$	$r_2$
mg-coarse-solver-maxiter	$n_0$	$n_1$	$n_2$
mg-nu-post	$\nu_0^{post}$	$\nu_1^{post}$	$\nu_2^{post}$
mg-nu-pre	$ u_0^{\mathrm{pre}}$	$\nu_1^{\rm pre}$	$\nu_2^{\mathrm{pre}}$
mg-smoother-tol	$r_0^s$	$r_1^s$	$r_2^s$
mg-omega	$\omega_0$	$\omega_1$	$\omega_2$

Details

parameter	lvl 0	lvl 1	lvl 2
mg-mu-factor	$\mu_0 $	$\mu_1$	$\mu_2$
mg-coarse-solver-tol	$r_0$	$r_1$	$r_2$
mg-coarse-solver-maxiter	$\cdot n_0 \prec$	$n_1 <$	$n_2$ $\checkmark$
mg-nu-post	$\nu_0^{post}$	$\nu_1^{post}$	$\nu_2^{post}$
mg-nu-pre	$\nu_0^{pre}$	$\nu_1^{\rm pre}$	$\nu_2^{pre}$
mg-smoother-tol	$r_0^s$	$r_1^s$	$r_2^s$
mg-omega repeat	$\omega_0$	$\omega_1$	$\omega_2$

#### Global tuning procedure parameters

- Number of tuning steps per gauge configuration, *N* (f.ex. 100).
- Tolerance  $\delta$ : stop tuning the current parameter, f.ex.  $t_i/t_{\rm best} > 0.995$
- Threshold  $\rho$ : ignore fluctuations when choosing  $t_{\rm best}$ , f.ex.  $t_i/t_{\rm best} > 0.999$

Details

parameter		lvl 0	lvl 1	lvl 2
mg-mu-factor		$\mu_0 \gamma$	$\mu_1$	$\mu_2$
mg-coarse-solver-	tol	$r_0 \checkmark$	$r_1$	$r_2$
mg-coarse-solver-	maxiter	$n_0$	$n_1$	$n_2$
mg-nu-post		$\nu_0^{post}$	$\nu_1^{post}$	$ u_2^{post}$
mg-nu-pre		$\nu_0^{pre}$	$\nu_1^{pre}$	$\nu_2^{pre}$
mg-smoother-tol		$r_0^s$	$r_1^s$	$r_2^s$
mg-omega	repeat M2 <=	$\omega_0$ )	$\omega_1$	$\omega_2$

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#### For each parameter p on level $\ell$

- maximum number of steps to be done  $n_p^\ell$
- change in parameter per step  $\pm \Delta_p^\ell$
- 1 perform  $n_p^\ell$  steps of  $p^\ell + \Delta_p^\ell,$  or until timing stops improving
- 2 if timing does not improve (or worsens), move to next p on current  $\ell$
- 3 move to next-finest level and follow same sequence
- 4 if step i < N, go back to (1)
- 4 if step i = N, move to next gauge configuration, reset i = 0

## Tuning MG parameters for a $112^3 \cdot 224$ ensemble at $M_{\pi}^{\text{phys}}$ (from above, LUMI-G)

#### tuning from above reducing cost step-by-step

#### Initial parameters:

parameter	Ivl 0	Ivl 1	lvl 2
mg-mu-factor	1.0	1.0	30.0
mg-coarse-solver-tol	0.05	0.05	0.05
mg-coarse-solver-maxiter	50	50	50
mg-nu-post	6	6	6
mg-nu-pre	6	6	6
mg-smoother-tol	0.05	0.05	0.05
mg-omega	0.85	0.85	0.85

- Positive  $\Delta$  for:
- ▶ mg-mu-factor
- mg-coarse-solver-tol
- ▶ mg-smoother-tol
- Negative  $\Delta$  for:
- mg-coarse-solver-maxiter
- ▶ mg-nu-post
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mg-coarse-solver-maxiter	50	50	50
mg-nu-post	6	6	6
mg-nu-pre	6	6	6
mg-smoother-tol	0.05	0.05	0.05
mg-omega	0.85	0.85	0.85

- Positive  $\Delta$  for:
  - ▶ mg-mu-factor
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  - ▶ mg-nu-post
  - ▶ mg-nu-pre



from 40+ seconds to  $\sim$  8 seconds in a few hundred solves

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mg-mu-factor	1.0	1.0	30.0
mg-coarse-solver-tol	0.55	0.55	0.55
mg-coarse-solver-maxiter	5	5	5
mg-nu-post	1	1	1
mg-nu-pre	1	1	1
mg-smoother-tol	0.55	0.55	0.55
mg-omega	0.85	0.85	0.85

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  - ▶ mg-nu-post
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- mg-coarse-solver-tol
- ▶ mg-smoother-tol



# from non-convergence to $\sim$ 7 seconds in a few hundred solves

#### Tuning MG parameters for a $112^3 \cdot 224$ ensemble at $M_{\pi}^{\text{phys}}$ (Comparison) tuning from above funing from below





40

30

solve-time

config ID

7.5 to 9 seconds

#### 6.5 to 7 seconds

(depending on gauge configuration)

tuning iteration

Let's recall the  $112^3 \cdot 224$  ensemble @  $M_{\pi}^{\text{phys}}$  running on LUMI-G.

#### Juwels Booster

28 nodes

- Before tuning:  $\sim$  6 seconds / solve
- After tuning:  $\sim$  4 seconds / solve

# LUMI-G 28 nodes • Before tuning: ~ 14 seconds / solve

 $\bullet\,$  After tuning:  $\sim$  7 seconds / solve

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This was way more impressive back in 2023 when we went from 41 to  $\sim$  10 seconds.

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Nice corollary: can also further improve coarse-grid-deflated solver, used to good effect on LUMI-G.

 $\Rightarrow$  Useful also for measurement campaigns.

## Limitations

- Not currently integrated into HMC.
  - Currently: need to prepare set of configurations and perform separate run.
  - ► Integration directly into HMC possible: tuner is already called from within fermionic derivative.
- Not tested on untwisted Wilson clover.
- Should work out of the box, need gauge configs in ILDG format. (ignore mg-mu-factor)
- Does not tune parameters which need MG setup to be regenerated.
  - Required logic extension simple but tedious.
- Some of the parameter evolution does not seem to make a lot of sense.
  - Might require some more fine-tuned intervention logic.
- Thresholds and starting parameters can have big impact on tuning quality.
- Need some more systematic guidelines to judge impact of lattice spacing, target quark mass and lattice volume.

## Where to get it?

If you want to play around with the code:

- https://github.com/etmc/tmLQCD/tree/deriv\_mg\_tune
- deriv\_mg\_tune executable
- all input file parameters explained in documentation
- quda\_interface.c: quda\_mg\_tune\_params function (and various helper functions)

Many thanks for your attention!

## Backup

**Backup Slides** 

## Comparison between Juwels Booster and LUMI-G

tuning from above



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