

Domain Decomposition Multigrid for Lattice QCD

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Algebraic Multigrid

Numerical Results

Summary & Outlook



Algebraic Multigrid: DD- α AMG

Task: Solution of (Clover) Wilson Dirac systems

$$D(a, m_0)\psi = \eta$$

Problem: $D(a, m_0)$ ill-conditioned for $a \rightarrow 0$, $m_0 \rightarrow m_{crit}$

Idea: Adaptive Algebraic Multigrid Approach

Two-grid error propagator for ν steps of post-smoothing

$$E_{2g}^{(\nu)} = (1 - MD)^\nu (1 - PD_c^{-1}P^\dagger D), \quad D_c := P^\dagger DP$$

Multigrid extension by introducing recursive construction for D_c

To Do: Define interpolation P and smoother M

DD- α AMG^[ArXiv:1303.1377,1307.6101]

M : Schwarz Alternating Procedure (SAP)

[Hermann Schwarz 1870; Martin Lüscher 2003]

P : Aggregation Based Interpolation

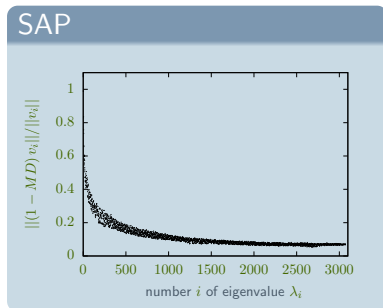
[Brannick, Clark et al. 2010]



The Algebraic Multigrid Principle

Smoother: $1 - MD$

- ▶ Effective on **high modes**
- ▶ **low modes** remain



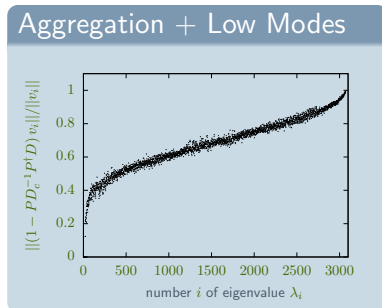
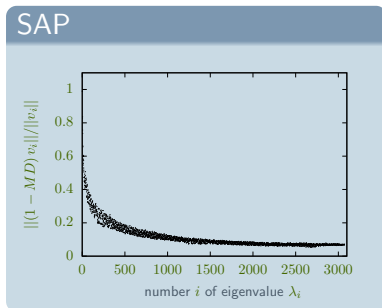
$$Dv_i = \lambda_i v_i \quad \text{with} \quad |\lambda_1| \leq \dots \leq |\lambda_{3072}|$$



The Algebraic Multigrid Principle

Coarse-grid correction: $1 - PD_c^{-1}P^\dagger D$

- **Low modes** built into interpolation P
- ⇒ Effective on **low modes**



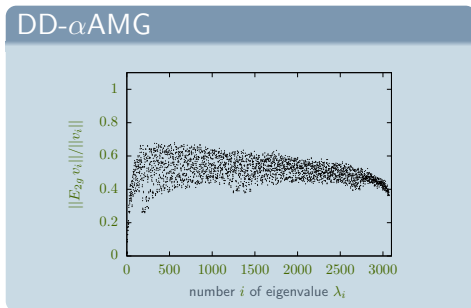
$$Dv_i = \lambda_i v_i \quad \text{with} \quad |\lambda_1| \leq \dots \leq |\lambda_{3072}|$$



The Algebraic Multigrid Principle

Two-grid method: $E_{2g} = (1 - MD)(1 - PD_c^{-1}P^\dagger D)$

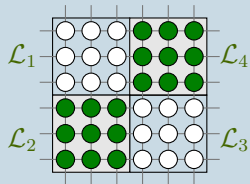
- ▶ Complementarity of smoother and coarse-grid correction
- ▶ Effective on **all modes!**



$$Dv_i = \lambda_i v_i \quad \text{with} \quad |\lambda_1| \leq \dots \leq |\lambda_{3072}|$$



SAP: Schwarz Alternating Procedure

Two color decomposition of \mathcal{L} 

- ▶ canonical injections

$$\mathcal{I}_{\mathcal{L}_i} : \mathcal{L}_i \rightarrow \mathcal{L}$$

- ▶ block restrictions

$$D_{\mathcal{L}_i} = \mathcal{I}_{\mathcal{L}_i}^\dagger D \mathcal{I}_{\mathcal{L}_i}$$

- ▶ block inverses

$$B_{\mathcal{L}_i} = \mathcal{I}_{\mathcal{L}_i} D_{\mathcal{L}_i}^{-1} \mathcal{I}_{\mathcal{L}_i}^\dagger$$

Algorithm SAP

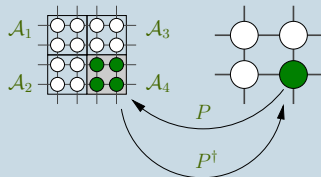
- 1: in: ψ, η, ν – out: ψ
 - 2: **for** $k = 1$ to ν **do**
 - 3: $r \leftarrow \eta - D\psi$
 - 4: **for all green** \mathcal{L}_i **do**
 - 5: $\psi \leftarrow \psi + B_{\mathcal{L}_i} r$
 - 6: **end for**
 - 7: $r \leftarrow \eta - D\psi$
 - 8: **for all white** \mathcal{L}_i **do**
 - 9: $\psi \leftarrow \psi + B_{\mathcal{L}_i} r$
 - 10: **end for**
 - 11: **end for**
-



Aggregation Based Interpolation

Construction:

- Define aggregates: domain decomposition $\mathcal{A}_1, \dots, \mathcal{A}_s$



- Calculate test vectors w_1, \dots, w_N [ArXiv:1303.1377,1307.6101]
- Decompose test vectors over aggregates $\mathcal{A}_1, \dots, \mathcal{A}_s$

$$(w_1, \dots, w_N) = \begin{array}{|c|} \hline \text{---} \\ \hline \end{array} = \begin{array}{c} \mathcal{A}_1 \\ \mathcal{A}_2 \\ \vdots \\ \mathcal{A}_s \end{array} \rightarrow P = \left(\begin{array}{c} \mathcal{A}_1 \\ \mathcal{A}_2 \\ \vdots \\ \mathcal{A}_s \end{array} \right)$$



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Numerical Results: Configurations

| id | lattice size $N_t \times N_s^3$ | pion mass m_π [MeV] | CGNR iterations | shift m_0 | clover term c_{sw} | provided by |
|----|------------------------------------|----------------------------|--------------------|----------------|-------------------------|-------------|
| 1 | 48×48^3 | 135 | 53,932 | -0.09933 | 1.00000 | BMW-c [1,2] |
| 2 | 64×32^3 | ? | 11,370 | -0.06430 | 1.00000 | BMW-c [1,2] |
| 3 | 64×64^3 | 135 | 84,207 | -0.05294 | 1.00000 | BMW-c [1,2] |
| 4 | 128×64^3 | 270 | 45,804 | -0.34262 | 1.75150 | CLS [3,4] |
| 5 | 128×64^3 | 190 | 88,479 | -0.33485 | 1.90952 | CLS [3,4] |

- [1]: S. Durr et al., Lattice QCD at the Physical Point: Simulation and Analysis Details, JHEP, 08(2011)148.
- [2]: S. Durr et al., Lattice QCD at the Physical Point: Light Quark Masses, Phys. Lett. B701, (2011), pp. 265-268.
- [3]: CLS, Coordinated Lattice Simulation.
<https://twiki.cern.ch/twiki/bin/view/CLS/>.
- [4]: P. Fritzscht et al., The Strange Quark Mass and Lambda Parameter of Two Flavor QCD, Nucl. Phys., B865 (2012), pp. 397-429.



Numerical Results: Parameters

| | parameter | | default |
|---------|---|------------|-------------------|
| setup | number of iterations | n_{inv} | 6 |
| | number of test vectors | N | 20 |
| | size of lattice-blocks for aggregates/Schwarz blocks on level 1 | | 4 ⁴ |
| | size of lattice-blocks for aggregates/Schwarz blocks on level $\ell > 1$ | | 2 ⁴ |
| | coarse system relative residual tolerance (stopping criterion for the coarse system) ^(*) | ϵ | $5 \cdot 10^{-2}$ |
| solver | restart length of FGMRES | n_{kv} | 10 |
| | relative residual tolerance (stopping criterion) | tol | 10 ⁻¹⁰ |
| | number of post-smoothing steps ^(*) on level 1 | ν | 2 |
| | number of post-smoothing steps ^(*) on level $\ell > 1$ | | 3 |
| | number of Minimal Residual (MR) iterations to solve the local systems in SAP ^(*) on level 1 | | 4 |
| | number of MR iterations ^(*) on level $\ell > 1$ | | 3 |
| K-cycle | maximal length ^(*) | | 5 |
| | maximal restarts ^(*) | | 2 |
| | relative residual tolerance (stopping criterion) ^(*) | | 10 ⁻¹ |

(*) : same in solver and setup



Comparison with biCGstab for Different Cost Measures

Configuration 3: 64×64^3

| | three-level DD- α AMG | two-level DD- α AMG | odd-even MP biCGstab |
|-------------------------|---------------------------------|-------------------------------|-------------------------|
| processes | 128 | 128 | 4,096 |
| solve time | 75.2s | 130s | 156s |
| consumed core minutes | 160 | 277 | 10,600 |
| consumed Mflop per site | 1.64 | 2.97 | 69.7 |
| Gflop/s per core | 2.86 | 2.99 | 1.83 |

biCGstab vs. 3 Level DD- α AMG

- ▶ $66.3\times$ consumed core minutes
- ▶ $42.5\times$ consumed Mflop per lattice site

2 Level DD- α AMG vs. 3 Level DD- α AMG

- ▶ $1.73\times$ consumed core minutes
- ▶ $1.81\times$ consumed Mflop per lattice site



Comparison with biCGstab for Different Cost Measures

Configuration 3: 64×64^3

| | three-level DD- α AMG | two-level DD- α AMG | odd-even MP biCGstab |
|-------------------------|---------------------------------|-------------------------------|-------------------------|
| processes | 128 | 128 | 4,096 |
| setup+solve time | 819s | 866s | 156s |
| consumed core minutes | 1,744 | 1,856 | 10,600 |
| consumed Mflop per site | 17.9 | 20.0 | 69.7 |
| Gflop/s per core | 2.86 | 2.99 | 1.83 |

biCGstab vs. 3 Level DD- α AMG

- ▶ $6.08\times$ consumed core minutes
- ▶ $3.89\times$ consumed Mflop per lattice site

Note: Lattice QCD applications require

- ▶ at least 2 solves/cnfg (generation of configurations)
- ▶ mostly $\mathcal{O}(100)$ solves/cnfg (calculation of observables)



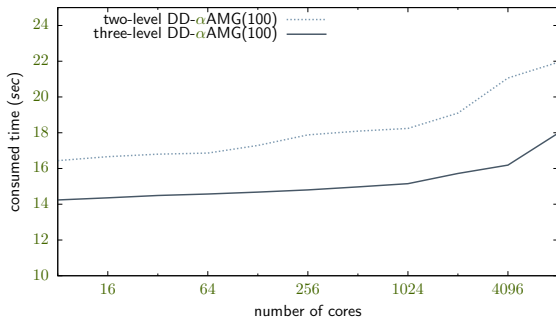
Comparison of 2, 3 & 4 Level DD- α AMG

| | configuration | 1 | 3 | 4 | 5 |
|---------------|-------------------|------------------|------------------|-------------------|-------------------|
| | lattice size | 48×48^3 | 64×64^3 | 128×64^3 | 128×64^3 |
| | pion mass m_π | 135 MeV | 135 MeV | 270 MeV | 190 MeV |
| two levels | setup time | 316s | 736s | 630s | 701s |
| | solve time | 48.6s | 130s | 113s | 141s |
| three levels | setup time | 374s | 744s | 719s | 948s |
| | solve time | 42.6s | 75.2s | 74.0s | 79.0s |
| four levels | setup time | – | 806s | 755s | 1,004s |
| | solve time | – | 79.8s | 75.7s | 79.1s |
| | processes | 81 | 128 | 256 | 256 |
| local lattice | level 1 | 16×16^3 | 32×16^3 | 32×16^3 | 32×16^3 |
| | level 2 | 4×4^3 | 8×4^3 | 8×4^3 | 8×4^3 |
| | level 3 | 2×2^3 | 4×2^3 | 4×2^3 | 4×2^3 |
| | level 4 | – | 2×1^3 | 2×1^3 | 2×1^3 |

- ▶ Conf. 1 slight speed up by using 3rd level
- ▶ Conf. 2, 3, 4 significant speed up by using 3rd level
- ▶ No use for 4th level yet



Weak Scaling: 2 and 3 Levels

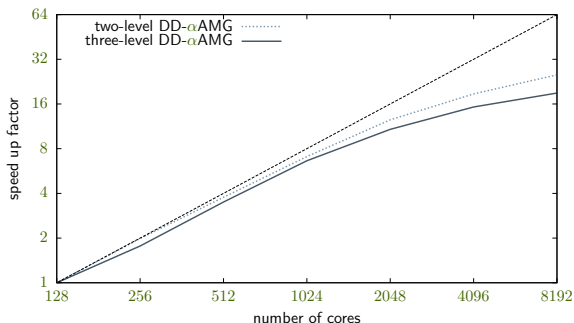


- ▶ 100 V-Cycles for 2 and 3 levels
- ▶ 16×8^3 local lattice per process
- ▶ Scaling behavior almost independent of number of levels
- ▶ Coarse solver: GMRES(32); profiling shows: slow down mainly caused by allreduce operations $\rightarrow \log(p)$ scaling



Strong Scaling: 2 and 3 Levels

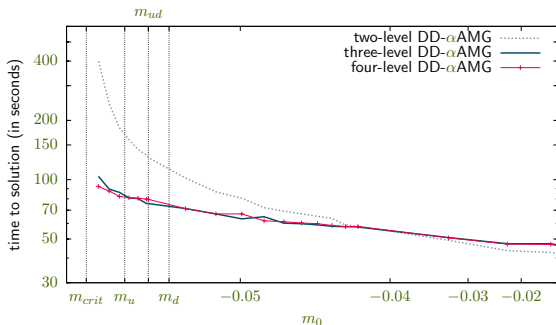
Configuration 3: 64×64^3



- ▶ Scaling behavior only slightly corrupted by adding an additional level, although there are
 - ▶ Idle times on third level
 - ▶ Worse data/comm ratio on third level



Scaling with the Mass Parameter: 2, 3 & 4 Levels

Configuration 3: 64×64^3 , 128 cores

- ▶ 3 & 4 levels clearly show improved scaling
- ▶ Speed up factor roughly 2 at m_u
- ▶ 4 levels best beyond m_u
- ▶ Consider using 4th level for future calculations



The Inexact Deflation Method [Lüscher 2007]

Let $\pi_L = 1 - DPD_c^{-1}P^\dagger$ and $\pi_R = 1 - PD_c^{-1}P^\dagger D$.

Using these projections and $D\pi_R = \pi_LD$, we decompose $D\psi = \eta$ into

$$D\pi_R\psi = \pi_L\eta \quad \text{and} \quad (1)$$

$$D(1 - \pi_R)\psi = (1 - \pi_L)\eta. \quad (2)$$

(2) is simplified to $(1 - \pi_R)\psi = PD_c^{-1}P^\dagger\eta$.

(1) is solved via GCR preconditioned with SAP.

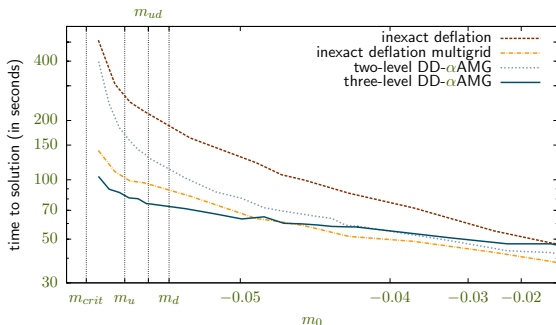
Notes:

- ▶ Occurrence of D_c^{-1} in (1) and (2) yields that

$$\|\eta - D\psi\| < tol \Rightarrow \|\eta_c - D_c\psi_c\| < tol.$$

- ▶ One step multigrid method due to exact complementarity
 - ▶ disadvantage: costly smoother



2 & 3 Level DD- α AMG, Inexact DeflationConfiguration 3: 64×64^3 , 128 cores

- ▶ 32 test vectors for inex. defl. w. inex. proj.^[OpenQCD 1.2]
- ▶ Inex. defl. w. inex. proj. scales better than ordinary inex. defl.^[DD-HMC 1.2.2] and 2 level DD- α AMG
- ▶ 3 level DD- α AMG shows best scaling behavior
- ▶ 3 levels perform best in range of m_u and m_d



Intermediate Summary

Intermediate Summary:

- ▶ Multigrid beneficial for lattice QCD
- ▶ Outperforms oe-mp-biCGstab and inexact deflation
- ▶ 3 level DD- α AMG shows
 - ▶ pay off for large lattice sizes and smaller masses m_0
 - ▶ up to factor 2 speed up over 2 level DD- α AMG
 - ▶ great potential for future calculations



Boston & Boulder AMG

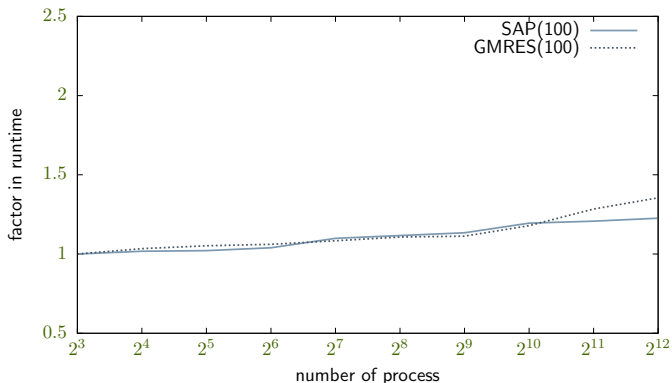
First AMG for LQCD by Brannick, Brower, Clark, Osborn et al.
 [ArXiv:0707.4018,0710.3612,0912.2186,1005.3043,1011.2775]

Comparison of ingredients:

| | DD- α AMG | AMG |
|----------------|---|---|
| interpolation | γ_5 -compatible aggregation | γ_5 -compatible aggregation |
| smoother | SAP \oplus data locality / arithmetic intensity \oplus communication avoidance | GCR \oplus convergent method |
| setup | inverse iteration using DD- α AMG \oplus bootstrapping \rightarrow speed up | inverse iteration using GCR/BiCGStab \oplus convergent inverse iteration |
| implementation | \oplus fast coarse grid setup | \oplus SSE-optimization \oplus publicly available |



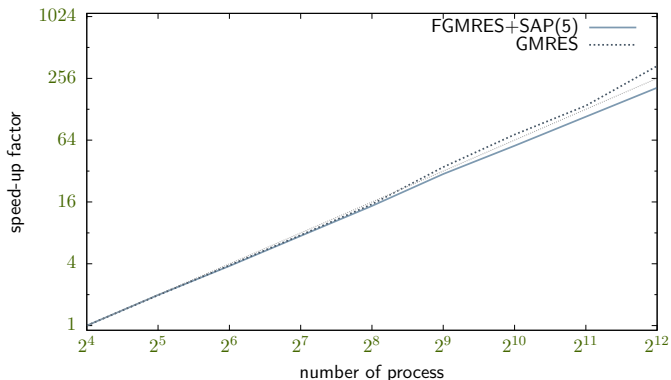
Weak Scaling SAP(100) and GMRES(100)



- ▶ 8×4^3 local lattice
- ▶ beyond 2^{10} cores all-to-all communication becomes visible



Strong Scaling FGMRES+SAP(5) and GMRES



- ▶ 64×32^3 lattice (conf id 2)
- ▶ GMRES suffers from cache effects for large local volumes



Comparison Within Common Code Framework: 2 Levels

Comparison of DD- α AMG with AMG for cnfg 3 (64×64^3 lat)

- ▶ independently tuned parameters for both methods, 8,192 cores
- ▶ Bootstrap setup for both approaches

| | AMG | DD- α AMG | speed-up factor |
|---------------|-------|------------------|-----------------|
| smoother iter | 6 | 2 | |
| setup iter | 5 | 5 | |
| setup time | 19.7s | 17.7s | 1.11 |
| smoother time | 0.60s | 0.40s | 1.50 |
| solve iter | 23 | 23 | |
| solve time | 3.76s | 3.07s | 1.22 |
| total time | 23.5s | 20.8s | 1.13 |

- ▶ Speed-up factor for smoother: $1.5\times$
- ▶ two grid method, 8,192 cores \rightarrow time spent on coarse grid predominates



Comparison Within Common Code Framework: 4 Levels

Comparison of DD- α AMG with AMG for cnfg 3 (64×64^3 lat)

- ▶ independently tuned parameters for both methods, 128 cores
- ▶ Bootstrap setup for both approaches

| | 4 level AMG | 4 level DD- α AMG | speed-up factor |
|---------------|----------------|-----------------------------|-----------------|
| smoother iter | 6 | 1 | |
| setup iter | 6 | 6 | |
| setup time | 815s | 541s | 1.51 |
| solve iter | 23 | 27 | |
| solve time | 60.6s | 41.4s | 1.46 |
| total time | 876s | 582s | 1.51 |

- ▶ Smoother now used on coarser grids as well
→ speed-up factor of $1.5\times$ carried over to total time



Comparison with official AMG implementation in QOPQDP: 2 Levels

Comparison for different cnfgs and parallelizations, $\text{tol}=1\text{E-}5$

- ▶ AMG-d uses default parameter settings
- ▶ AMG- k uses k iterations of GCR per inverse iteration step

| | cnfg 3, 128 cores | | | cnfg 4, 256 cores | | |
|------------|--------------------|--------|------------------|--------------------|--------|------------------|
| | AMG-d | AMG-20 | DD- α AMG | AMG-d | AMG-10 | DD- α AMG |
| setup time | 2451s | 838s | 896s | 2552s | 629s | 656s |
| solve iter | 14 | 22 | 10 | 13 | 21 | 11 |
| solve time | 44.8s | 65.7s | 57.1s | 36.3s | 50.6s | 37.3s |
| | cnfg 3, 8192 cores | | | cnfg 4, 8192 cores | | |
| | AMG-d | AMG-40 | DD- α AMG | AMG-d | AMG-20 | DD- α AMG |
| setup time | 66.0s | 30.5s | 27.7s | 102s | 30.9s | 32.3s |
| solve iter | 14 | 16 | 10 | 13 | 16 | 11 |
| solve time | 5.76s | 7.34s | 1.82s | 4.35s | 5.01s | 1.86s |

- ▶ For smaller parallelizations AMG setup can be comparatively expensive but yielding faster solver
- ▶ DD- α AMG superior for larger parallelizations



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Summary:

Schwarz smoother

- ▶ Slight speed up for 2 levels
- ▶ $1.5\times$ speed up for 4 levels

DD- α AMG Code

- ▶ large parallelizations: faster than QOPQDP
- ▶ small parallelizations: setup cheaper but solver slower
- ▶ Iteration count always lower than for QOPQDP

Outlook:

- ▶ Improve setup procedure
- ▶ SSE/AVX optimization
- ▶ Open source



All results computed on JUROPA at
Jülich Supercomputing Centre (JSC)



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(SFB TR 55)



All configurations provided by BMW-c & CLS

