# A Multigrid Bases Eigensolver for the Hermitian Wilson Dirac Operator 

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## Outline

## AMG for Lattice QCD

Rayleigh Quotient Iteration + AMG

Numerical Results

Summary \& Outlook
M. Rottmann et al., MG Eigensolver for $Q$

Adaptive Algebraic Multigrid Approach for $D^{\text {(non-Hermitian) }}$

Two-grid error propagator for $\nu$ steps of post-smoothing

$$
E_{2 g}^{(\nu)}=\underbrace{(1-M D)^{\nu}}_{\text {smoother }} \underbrace{\left(1-P D_{c}^{-1} P^{\dagger} D\right)}_{\text {coarse grid correction }}, \underbrace{D_{c}:=P^{\dagger} D P}_{\text {coarse operator }}
$$

- low accuracy for $D_{c}^{-1}$ and $M$ is sufficient
- introduce recursive construction for $D_{c} \rightarrow$ multigrid

To Do: Define interpolation $P$ and smoother $M$

## DD- $\alpha$ AMG ${ }^{[A-X i v: 1303.1377,1307.6101]}$

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: $\quad 1-M D$

- effective on "large eigenvectors"
- "small eigenvectors" remain


$$
D v_{i}=\lambda_{i} v_{i} \quad \text { with } \quad\left|\lambda_{1}\right| \leq \ldots \leq\left|\lambda_{3072}\right|
$$

## The Algebraic Multigrid Principle

Coarse-grid correction: $\quad 1-P D_{c}^{-1} P^{\dagger} D$

- small eigenvectors built into interpolation $P$
$\Rightarrow$ effective on small eigenvectors


$$
D v_{i}=\lambda_{i} v_{i} \quad \text { with } \quad\left|\lambda_{1}\right| \leq \ldots \leq\left|\lambda_{3072}\right|
$$

## Aggregation + Small EV




## The Algebraic Multigrid Principle

$$
\text { Two-grid method: } \quad E_{2 g}=(1-M D)\left(1-P D_{c}^{-1} P^{\dagger} D\right)
$$

- complementarity of smoother and coarse-grid correction
- effective on all eigenvectors!


## DD- $\alpha$ AMG



$$
D v_{i}=\lambda_{i} v_{i} \quad \text { with } \quad\left|\lambda_{1}\right| \leq \ldots \leq\left|\lambda_{3072}\right|
$$

AMG for $D$ in Practice: Scaling with the bare quark mass
Configuration: $64 \times 64^{3}, 128$ cores


- lighter quark mass $m_{0} \rightarrow$ more ill-conditioned system
- AMG less sensitive to condition number than Krylov subspace methods


## Adaptive Algebraic Multigrid Approach for $Q=\gamma_{5} D$

Construct $P$ such that $P \gamma_{5}=\gamma_{5} P$
Replacing $D \rightarrow Q=\gamma_{5} D$ we obtain the two-grid error propagator

$$
\tilde{E}_{2 g}^{(\nu)}=\underbrace{(1-M Q)^{\nu}}_{\text {requires new smoother }} \underbrace{\left(1-P Q_{c}^{-1} P^{\dagger} Q\right)}_{=1-P D_{c}^{-1} P^{\dagger} D}, \underbrace{Q_{c}:=P^{\dagger} Q P}_{\text {new coarse operator }}
$$

- $P$ is valid for $D$ and $Q$
- $P$ preserves $Q_{c}^{\dagger}=Q_{c} \rightarrow$ recursive application possible
- SAP smoother does not work anymore

Choice: Replace $M$ by GMRES

- AMG for $Q$ in practice a factor of 2 slower than DD- $\alpha$ AMG
- enables to compute $(Q-\sigma)^{-1}$ with AMG and thus to compute small eigenvectors of $Q$ (application $\rightarrow$ J. Simeth)


## Calculating Eigenvectors of $Q$

## Algorithm 1: Rayleigh Quotient Iteration + AMG

input: number of eigenvectors $N$, desired accuracy $\varepsilon$
output: eigenvectors $v_{1}, \ldots, v_{N}$
1 let $v_{1}, \ldots, v_{N}$ orthonormalized set of random vectors and

$$
\lambda_{i}=0, \varepsilon_{i}=1 \forall i=1, \ldots, N
$$

2 build $P$ from $v_{1}, \ldots, v_{N}$
3 while $\exists \varepsilon_{i}: \varepsilon_{i}>\varepsilon$ do
$4 \quad$ for all $i=1, \ldots, N$ with $\varepsilon_{i}>\varepsilon$ do
5
6
7
8
9
10
11
$\sigma \leftarrow \lambda_{i} \cdot \max \left(1-\varepsilon_{i}, 0\right)$
$v_{i} \leftarrow(Q-\sigma)^{-1} v_{i}$
$v_{i} \leftarrow v_{i}-\sum_{j=1}^{i-1}\left(v_{j}^{\dagger} v_{i}\right) v_{j}$
$v_{i} \leftarrow v_{i} /\left\|v_{i}\right\|$
update $v_{i}$ in interpolation $P$
$\lambda_{i}=v_{i}^{\dagger} Q v_{i}$
$\varepsilon_{i}=\left\|Q v_{i}-\lambda_{i} v_{i}\right\|$


## Comparison with PARPACK: Scaling with Lattice Size



- 20 smallest eigenpairs $\left(\lambda_{i}, v_{i}\right)$ with $\varepsilon<10^{-8}$
- different lattice sizes at constant physics
- Krylov subspace dimension for PARPACK: 100
- only two level multigrid solver, yet
- PARPACK for $64 \times 40^{3}$ did not converge within $2.4 \cdot 10^{4}$ core-h

Comparison with PARPACK: Scaling with the Number of Eigenvectors $N$


- $48 \times 24^{3}$ lattice
- Krylov subspace dimension for PARPACK: 200
- operator complexities: $P$ is $\mathcal{O}(N), Q_{c}$ is $\mathcal{O}\left(N^{2}\right)$ $\rightarrow$ coarse grid correction $/ Q_{c}^{-1}$ is at least $\mathcal{O}\left(N^{2}\right)$
- multigrid eigensolver more beneficial for small $N$

Comparison with PARPACK: Gauge Configuration Fluctuations


- 2 ensembles of configurations generated by a hybrid Monte-Carlo simulation
- 8 stochastically independent configurations from each ensemble
- only minor fluctuations in run-time


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- multigrid based eigensolver performs well for
- large lattice sizes
- moderate number of eigenpairs
- speed up can be orders of magnitudes


## Application

- calculating $\operatorname{tr}\left(Q^{-1}\right)$ via low mode averaging $\rightarrow$ talk of $J$ Jimeth (coming up next)
- deflated stochastic algorithm
- small number of deflated modes
- low accuracy modes


## Outlook

## Improve Eigensolver

- explore possible benefits of employing more than two levels in AMG solver
- try other shifted inversion based eigensolver approaches as
- Jacobi-Davidson
- shift-and-invert Arnoldi
- FEAST
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