# Deflating QCD

# **Physical Concepts & Algorithms**

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The basic strategy adopted here is to

- ★ Choose a simple lattice formulation of QCD
- ★ Simulate large lattices:  $64 \times 32^3$ ,  $96 \times 48^3$ , ...
- ★ Try to "teach physics to the algorithms"

Low-mode deflation is an important case where physics insight is used to accelerate the computations

Neff et al. '01, Giusti et al. '03f, DeGrand & Schaefer '04 Bali et al. '05, Foley et al. '05, ML '07

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Moreover, the low modes of the Dirac operator are dense

$$\Delta\lambda\simrac{1}{\Sigma V},\qquad \Sigma=\lim_{m
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angle
ight|,\qquad V:$$
 lattice volume

Banks & Casher '80, Leutwyler & Smilga '92

#### Example:

Spectrum of  $(D^{\dagger}D)^{1/2}$ in two-flavour QCD  $48 \times 24^3$  lattice a = 0.08 fm  $m_{\rm sea} \sim \frac{1}{4}m_{\rm s}$ 

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According to Banks & Casher, the number of low modes is

$$N_{|\lambda| \le M} = \frac{2}{\pi} M \Sigma V + \mathcal{O}(M^2)$$

For illustration, set M = 100 MeV,  $\Sigma = (250 \text{ MeV})^3$ ,  $V = 2L^4$ 

$$\Rightarrow N_{|\lambda| \le M} = \begin{cases} 21 & L = 2 \text{ fm} \\ 107 & L = 3 \text{ fm} \\ 338 & L = 4 \text{ fm} \end{cases}$$

- $\star$  Actual numbers are  $\sim 1.4$  times larger
- ★ Practically continuous spectrum
   ⇒ individual modes do not matter so much!

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Deflation  $\equiv$  separation and special treatment of the low modes

#### Example:

Let P be the projector to the N lowest modes of  $A = D^{\dagger}D$ 

$$A = PAP + (1 - P)A(1 - P) \equiv A_{\parallel} + A_{\perp}$$

$$A\psi = \eta \quad \Leftrightarrow \quad \begin{cases} A_{\parallel}\psi_{\parallel} = \eta_{\parallel} & \text{``little system''} \\ A_{\perp}\psi_{\perp} = \eta_{\perp} & \text{``deflated system''} \end{cases}$$

- The little system can be solved directly
- If enough modes are projected away, the deflated system is well conditioned and can be solved rapidly using the CG algorithm

A recent proposition is to compute the eigenvectors "on the fly", using the Krylov space implicitly constructed by the solver Stathopoulos & Orginos '07, Morgan & Wilcox '07

However

- Accurate computations of eigenvectors tend to be very expensive
- ★ In the large-volume regime of QCD, there are O(V) low modes ⇒ deflation overhead grows like  $V^2$

Textbook deflation is therefore not a viable option on large lattices

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# Deflation without eigenvectors

- Obmain-decomposed deflation projectors
- O Applications

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Let  ${\boldsymbol{P}}$  be a projector to any subspace of quark fields. Define

PDP: little Dirac operator

$$\{\underbrace{1-DP(PDP)^{-1}P}_{\text{oblique projector }P_L}\} D \equiv \hat{D}: \text{ deflated operator}$$

The solution of the Dirac equation  $D\psi = \eta$  then splits into two parts

$$\psi(x) = \chi(x) + (PDP)^{-1}P\eta(x)$$

where

$$\hat{D}\chi(x) = P_L\eta(x), \qquad \left\{\underbrace{1 - P(PDP)^{-1}PD}_{-1}\right\}\chi(x) = \chi(x)$$

oblique projector  $P_R$ 

The condition number of  $\hat{D}$ 

$$\begin{split} \|\hat{D}\| \|\hat{D}^{-1}\| &\simeq \|D\| \|\hat{D}^{-1}\| \\ &= \|D\| \|(1-P)D^{-1}(1-P)\| \\ &\leq \|D\| \|(1-P)(D^{\dagger}D)^{-1}(1-P)\|^{1/2} \end{split}$$

will be much smaller than the one of D if

 $\|(1-P)\psi\|^2 \ll \|\psi\|^2$ 

for all low modes  $\psi$  of  $D^{\dagger}D$ 

Such projectors P can be constructed w/o knowing the low modes!

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#### **Domain-decomposed deflation projectors**

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 $96\times 48^3$  lattice, divided into 8192 domains of size  $6^4$ 

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Domain-decomposed deflation projectors

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Try to approximate the low modes in each domain separately, i.e.

$$P = \sum_{\text{blocks } \Lambda} P_{\Lambda}, \qquad P_{\Lambda}\psi(x) = \sum_{l=1}^{N_s} \phi_l^{\Lambda}(x) \left(\phi_l^{\Lambda}, \psi\right)$$

orthonormal, supported on  $\Lambda$ 

where  $N_s$  does not need be scaled with V

Somewhat surprisingly, this is in fact possible!

Note that the application of P requires only  $N_s V$  operations  $\Rightarrow V^2$ -problem will be solved in this way!

#### In the free quark theory, choosing constant block modes works well

Lattice size L, block size b

Low modes

 $\psi_p(x) = u_p \,\mathrm{e}^{ipx}$ 

Deflation deficits

$$\|(1-P)\psi_p\|^2 = \epsilon_p \|\psi_p\|^2$$
$$\epsilon_p = \frac{1}{12}p^2 (b^2 - a^2) + O(p^4 b^4)$$



 $\bigstar$  Deficits are independent of V

 $\bigstar$  Deflation modes are far from being eigenvectors of D

Application to (classical) PDE solvers: Frank & Vuik '01, Nabben & Vuik '06

The block projection can only work out if the low modes of  $D^{\dagger}D$  are locally coherent

That is, on each block  $\Lambda$ , they must align to a low-dimensional subspace of fields

Numerical experiments show this to be so, for every individual gauge-field configuration!







## Example

 $64 imes 32^3$  lattice, a=0.08 fm,  $m_{
m sea} \simeq rac{1}{4} m_{
m s}$ 

Block size  $4^4 \text{, } N_s = 12 \text{ modes per block}$ 

 $\phi_l^{\Lambda}(x) =$  lowest 12 eigenmodes of  $D^{\dagger}D$  projected to  $\Lambda$ 

 $\Rightarrow$  The next 36 eigenmodes have deflation deficits  $\epsilon = 3 - 6\%$ 

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In fact, any quark field  $\psi(x)$  that satisfies

 $\|D\psi\| \le M \|\psi\|, \qquad M \sim 100 \text{ MeV}$ 

is locally coherent with the low modes

 $\Rightarrow$  The projectors  $P_{\Lambda}$  can be constructed using  $N_s$  such modes instead of exact eigenmodes!

Can use approximate inverse iteration to generate them rapidly

See JHEP 0707 (2007) 081 [arXiv:0706.2298] and arXiv:0710.5417 for details

 $\Rightarrow$  Recipe for the generation of domain-decomposed deflation projectors

- Choose  $N_s$  random quark fields  $\psi_1, \ldots, \psi_{N_s}$
- Apply  $\sim 10$  approximate inverse iteration steps to them
- On each block  $\Lambda$ , set  $\phi_l^{\Lambda}(x) = \psi_l(x)|_{x \in \Lambda}$  and orthonormalize

The projector is then given by

$$P = \sum_{\text{blocks } \Lambda} \left\{ \sum_{l=1}^{N_s} \phi_l^{\Lambda} \otimes (\phi_l^{\Lambda})^{\dagger} \right\}$$

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 $\checkmark$  Quark propagator computations

 $\checkmark\,$  Acceleration of the HMC algorithm

? Low-mode averaging ("all-to-all propagators")

Giusti et al. 04, DeGrand & Schaefer '04, Bali et al. 05, Foley et al. 05

#### Quark propagator computations

The Dirac equation  $D\psi=\eta$  must typically be solved very many times in this case

Ideal for deflation, because the same projector P can be used for all source fields  $\eta$ 

However, it is advisable to combine deflation with a preconditioner

$$\psi(x) = \chi(x) + (PDP)^{-1}P\eta(x)$$
 (as before)

 $P_L D M \phi(x) = P_L \eta(x), \quad \chi(x) = P_R M \phi(x)$  (M: preconditioner)

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Required time/solution on a  $64 \times 32^3$  lattice,  $a \simeq 0.08$  fm,  $m_{\rm sea} \sim \frac{1}{4} m_{\rm s}$ 

EO: even-odd preconditioning

SAP: multiplicative Schwarz preconditioner

Timings taken on a PC cluster with 64 CPUs



### Acceleration of the HMC algorithm

The deflation efficiency of P can be maintained along the MD trajectories by applying an inverse iteration step from time to time

Typical history of the deflated solver iteration numbers along a trajectory



# Required time/trajectory on a $64 \times 32^3$ lattice, $a \simeq 0.08$ fm

Two-flavour QCD, n.p. O(*a*)-improved

DD-HMC: Domain Decomposition HMC algorithm

Timings taken on a PC cluster with 64 CPUs



- ★ Deflation works very well in lattice QCD
   ⇒ flat quark mass dependence
- $\star$  Domain-decomposed projectors provide a solution to the  $V^2\mbox{-}{\rm problem}$
- Variance-reduction methods using these remain to be explored

