

# Recent algorithm and machine developments for lattice QCD

Ken-Ichi Ishikawa (Hiroshima Univ.)

Lattice 2008, July 16



# 1. Plan of My Talk

## 2. Machine trends

- New machines
  - BG/P, T2K, QPACE project, Pet-Ape project.
- Many cores
  - GPGPU CUDA

## 3. Algorithmic developments for dynamical QCD (Wilson type)

- HMC with
  - Preconditioning for HMC action and UV/IR separation: Domain-Decomposition, RHMC, Schur complement...
  - Multiple timescale MD integrator
- Solver with
  - Inner-Outer(mixed prec.), Deflation, Adoptive Multi Grid.

## 4. Outlook: Physics at 1 Pflops

- Finer lattice (continuum limit or charm quark)
- Larger volume (multi hadron system)

## 2. Machine Trends

- New machines

- Blue Gene/P

- Successor of QCDSP, QCDOC, Blue Gene/L

[P.Boyle et al., IBM J. Res. and Dev. 49 (2005)

<http://www.research.ibm.com/journal/rd/492/boyle.html>]

- 4Way SMP PowerPC@0.85GHz
- Scalable 3D torus network
- Population is increasing
- Thin node / O(100,000) Many nodes
- Byte/Flop balanced
- Fine grained parallelization.



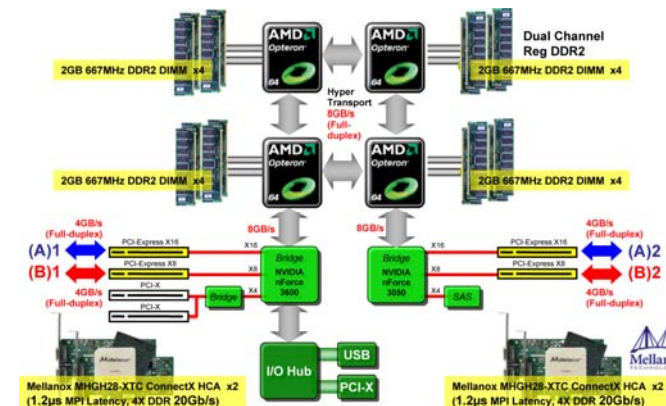
## 2. Machine Trends (cont'd)

- New machines

- T2K open super computer project  
(Tsukuba-Tokyo-Kyoto)

[<http://www.open-supercomputer.org/>]

- 4 Way Opteron (Barcelona) node cluster (commodity base).
- 648nodes@tsukuba, 147GFlops/node (Fat node)
- Quad core, 4 way
- Multi-rail fat tree network
- Many core / Fat node / O(1,000) few nodes
- Maintain Byte/Flop at each level
- Data Blocking is required



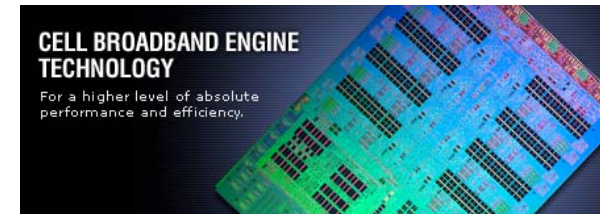
## 2. Machine Trends (cont'd)

- New machines (for QCD)

- **QPACE** project (QCD **PA**rallel computing on the **CELL/B.E.**)

2008-2009 [Poster by A. Nobile "Status of the QPACE Project"]

- Fund by Deutsche Forschungsgemeinschaft (DFG)
- Collaboration with IBM Germany.
- Dedicated for LQCD. 200TFlops (2009)
- Cell Broadband Engine cluster. [PowerXCell 8i, 102GFlops(DP)]
  
- Custom 3D torus Scalable network (FPGA)
- **Low power consumption 1.5W/GFlops**
- Many core / Fat node / O(1,000) Few nodes
- Maintain Byte/Flop at each level
- Data Blocking is required



QCD with CELL: Spary, Hill, Trew hep-lat/0804.3654;

S.Motoki & A. Nakamura Lat2007;

F.Belletti et al. LAT2007<sup>5</sup>

## 2. Machine Trends (cont'd)

- New machines

- **Pet-APE** project (Petaflops Array Processor Experiment)

[INFN APE Groupe, Italy, to appear in NUOVO CHIMENTO]

EMAIL From Davide Rossetti@ROMA1.INFN

- Successor of APEmille, apeNEXT.
- Reference computing platform for LQCD (2009-2014)
- Custom CPU: Apotto
- Custom Network ApeNet+ 3D Torus.
- Aiming for good price/performance.
- Thin node /  $O(100,000)$  Many nodes ?

## 2. Machine Trends (cont'd)

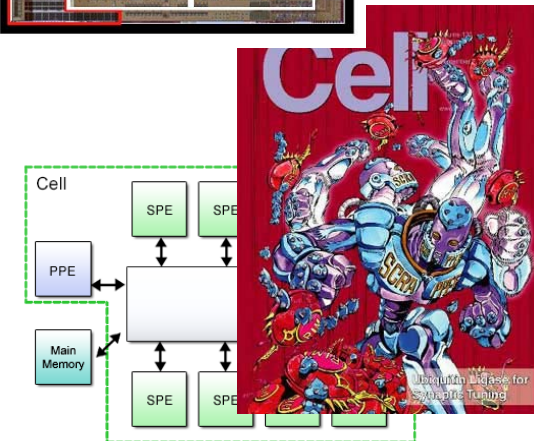
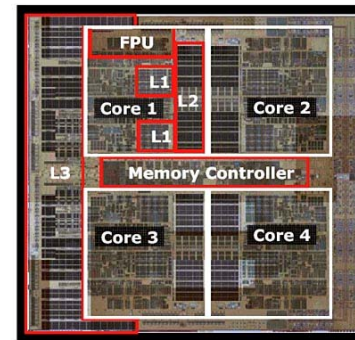
- Many cores (QPACE, T2K)

To make use of the full machinery of many transistors on a chip, many core architecture is employed for recent processor

- Intel: Core 2 Quad (4cores, 3GHz, 48GFlops),...
- AMD: Phenom (4cores, 2.4GHz, 38GFlops),...
- IBM: Power X Cell 8i (1+8cores, 3.2GHz, 102GFlops)
- SUN: UltraSparc T2 (8cores)

The trend is 8 cores, 16 cores,....., many cores

- Intel larrabee 80 cores?
- AMD/ATI GPGPU firestream 800 cores?
- NVIDIA GPGPU CUDA 240 cores?
- As a many core example , GPGPU



## 2. Machine Trends (cont'd)

### ● GPGPU

#### ○ “Lattice QCD as a video game”,

G.I.Egri, Z.Fodor, S.D.Katz, D.Nogradi,

K.K.Szabo, hep-lat/0611022.

- NVIDIA G80 arch. > 300 GFlops(SP)
- Lattice Wilson kernel > 30 GFlops
- Difficult to program using Graphic API (OpenGL)

#### ○ NVIDIA provides HPC GPGPU language

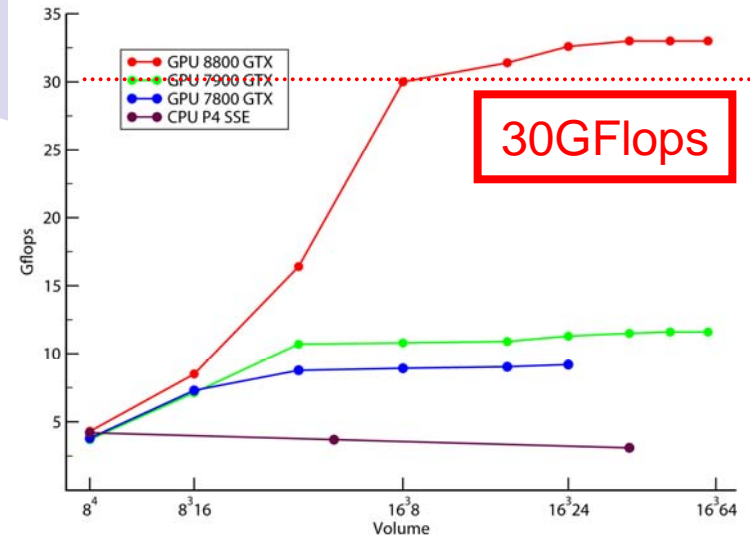
- CUDA (a C/C++ simple extension)
- Easy to learn, but requires hardware/memory model knowledge

[Poster by C. Rebbi, “Blastign Through Lattice Calc. using CUDA”  
talk by F. Di Renzo, “GPU computing for 2-d spin systems: CUDA vs OpenGL”]

#### ○ My experience with CUDA (GeForce 8800 GTX)

[**NO WARRANTY CUDA code**: [http://theo.phys.sci.hiroshima-u.ac.jp/~ishikawa/CUDA/CudaQCDSolver\\_0.06.tar.gz](http://theo.phys.sci.hiroshima-u.ac.jp/~ishikawa/CUDA/CudaQCDSolver_0.06.tar.gz)]

- Hopping matrix mult ( $16^4$ ) can also achieve > 40 GFlops.



C. Rebbi (Poster):  
Wilson Dirac 62GFlops!  
with Nvidia Tesla C870



## 2. Machine Trends (cont'd)

### ○ My experience with CUDA (GeForce 8800 GTX)

```
static __inline__ __device__
void matvec2(float *ur, float *ui, float *yr, float *yi, float
 *uyr, float *uyi){
    float ux3r,ux3i;

// 0-2
    ux3r = ur[1+COL*0]*ur[2+COL*1] + ui[2+COL*0]*ui[1+COL*1];
    ux3i = ur[2+COL*0]*ui[1+COL*1] + ui[2+COL*0]*ur[1+COL*1];
    ux3r = -ux3r;
    ux3i = -ux3i;
    ux3r += ui[1+COL*0]*ui[2+COL*1] + ur[2+COL*0]*ur[1+COL*1];
    ux3i += ur[1+COL*0]*ui[2+COL*1] + ui[1+COL*0]*ur[2+COL*1];
    ux3r = -ux3r;
    ux3i = -ux3i;

    *(uyr+0) = *(ur+0+COL*0) * *(yr+0);
    *(uyr+0) += *(ur+0+COL*1) * *(yr+1);
    *(uyr+0) += ux3r * *(yr+2);
    *(uyr+0) = - *(uyr+0);
    *(uyr+0) += *(ui+0+COL*0) * *(yi+0);
    *(uyr+0) += *(ui+0+COL*1) * *(yi+1);
    *(uyr+0) += ux3i * *(yi+2);
    *(uyr+0) = - *(uyr+0);
    *(uyr+0+COL) = *(ur+0+COL*0) * *(yr+0+COL);
    *(uyr+0+COL) += *(ur+0+COL*1) * *(yr+1+COL);
    *(uyr+0+COL) += ux3r * *(yr+2+COL);
    *(uyr+0+COL) = - *(uyr+0+COL);
    *(uyr+0+COL) += *(ui+0+COL*0) * *(yi+0+COL);
    *(uyr+0+COL) += *(ui+0+COL*1) * *(yi+1+COL);
    *(uyr+0+COL) += ux3i * *(yi+2+COL);
    *(uyr+0+COL) = - *(uyr+0+COL);
    *(uyi+0) = *(ur+0+COL*0) * *(yi+0);
    *(uyi+0) += *(ur+0+COL*1) * *(yi+1);
    *(uyi+0) += ux3r * *(yi+2);
    *(uyi+0) += *(ui+0+COL*0) * *(yr+0);
    *(uyi+0) += *(ui+0+COL*1) * *(yr+1);
    *(uyi+0) += ux3i * *(yr+2);
    *(uyi+0+COL) = *(ur+0+COL*0) * *(yi+0+COL);
    *(uyi+0+COL) += *(ur+0+COL*1) * *(yi+1+COL);
    *(uyi+0+COL) += ux3r * *(yi+2+COL);
    *(uyi+0+COL) += *(ui+0+COL*0) * *(yr+0+COL);
```

Cuda code example:  
Link variable times 2-Spinor code  
almost C language

For Single site data,

$w, y : 2 - \text{spinor}, U : SU(3) \text{ matrix}$

for  $\alpha = 1, 2$  and  $a = 1, 2, 3$

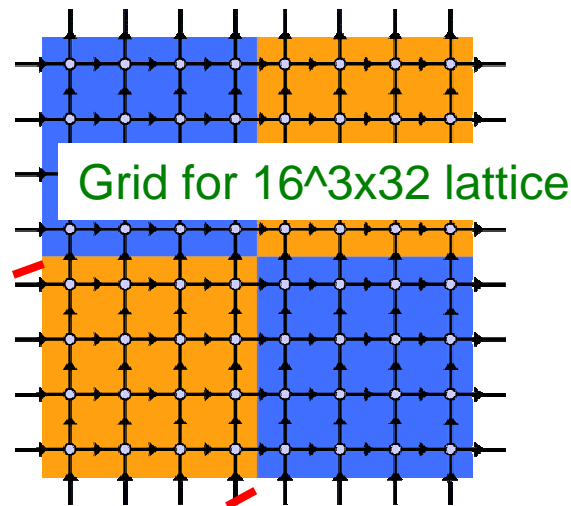
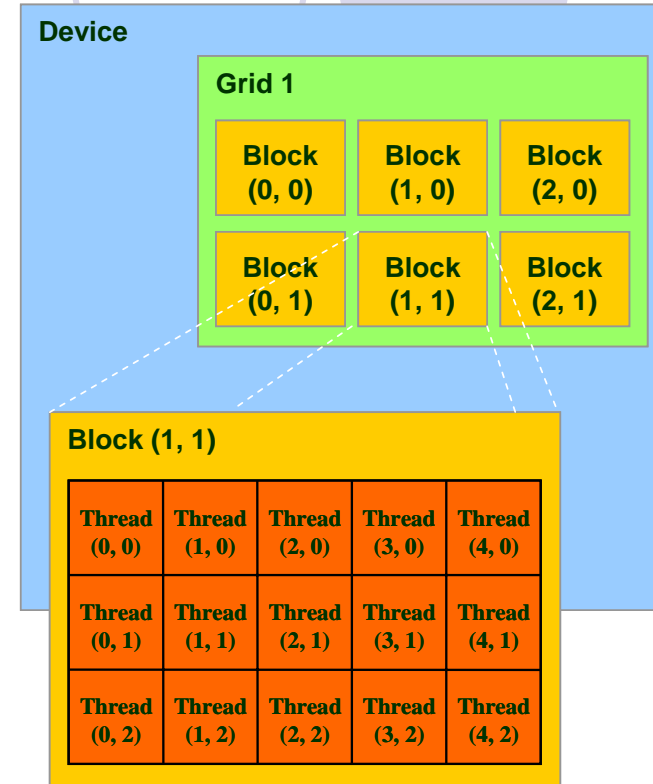
$$w(a, \alpha) = \sum_{b=1}^3 U(a, b) y(b, \alpha)$$

## 2. Machine Trends (cont'd)

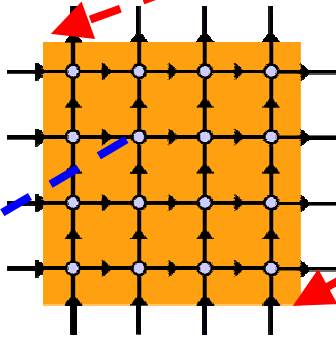
- My experience with CUDA (GeForce 8800 GTX)

### CUDA Programming model

- Single Program Multiple Data (SPMD)
- Nested threading. Grid / Block / Thread
- Thread ID + Block ID (Corresponds to MPI RANK)
- Block has local memory shared by threads in a block.



Block for  $4^3 \times 2$  lattice



Thread for single site

- Spinor data are vector loaded [100GByte/sec] on the shared memory on each block. They are reused by (max 8 times/ min 4 times).
- Link fields are loaded via Texture Fetching mechanism (Cached).

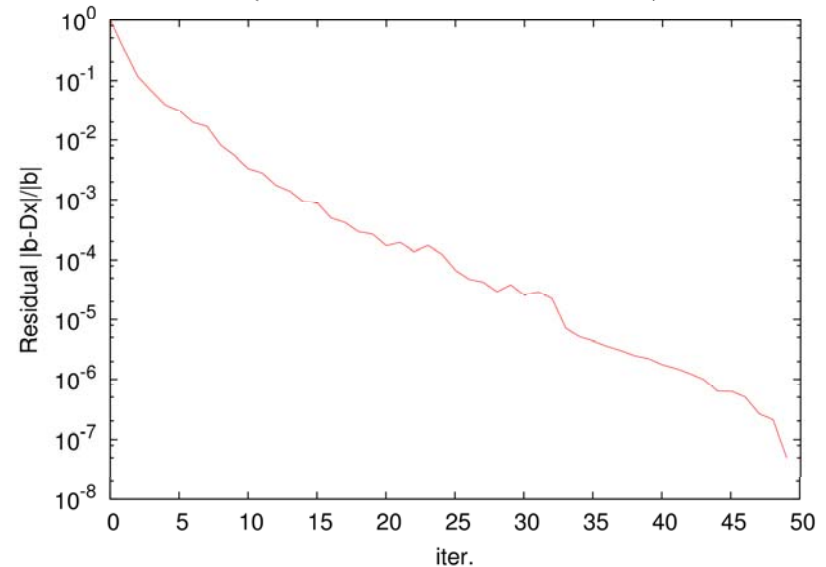
## 2. Machine Trends (cont'd)

- My experience with CUDA (GeForce 8800 GTX)

CUDA Language is Ready for Lattice QCD!!!

### A test result with CUDA solver (Single precision)

CUDA sample solver residual history [D.D.-preconditioned BiCGStab]  
(Lattice size:  $16^3 \times 32$ , block size:  $4^3 \times 2$ )



● CELL has similar feature?

● How about other accelerator?  
(AMD/ATI card, ClearSpeed)

See also CUDA Works in This conference:

- F. Di Renzo, "GPU computing for 2-d spin systems: CUDA vs OpenGL"
- C. Rebbi, "Blasting Through Lattice Calculations using CUDA"

CELL Works:

- V. Kindratenko, "Cell processor implementation of a MILC lattice QCD application"

## 2. Machine Trends (cont'd)

### ● GPGPU

This year Nvidia and AMD/ATI provide DP enabled architecture

- NVIDIA GT200 (Tesla 10series)
  - 240 SP (SP cores), 30 DP cores
  - ~1,000(or 600)GFlops(SP), ~90GFlops(DP)

C. Rebbi (Poster): Wilson Dirac 100 GFlops! with Nvidia GTX280



- AMD/ATI RV770 (Firestream 9250)
  - 640 SP units, (160 DP units?)
  - 1.2TFlops (SP), 200 GFlops (DP)
  - AMD Stream SDK



Product: AMD FireStream™ 9250  
(Available September 2008)

Breaking the 1 TFLOPS barrier at under 150 watts!

- For QCD
  - No ECC, check the result on the host side.
  - O(1000) thread programming/SIMD programming is required. (1site=1thread)
  - Make use of the Local memories attached each core for good efficiency.
  - Host ↔ device communication is limited by PCI-E x16 G2 speed (8GB/sec (sustained at 2GB/sec))

## 2. Machine Trends (cont'd)

- Thin node /  $O(100,000)$  nodes (BG/P , Pet-APE)
  - Uniform Fine Grained Parallelization is required.
  - 10GFlops/CPU, 100,000 nodes = 1PF
- Many cores / Fat node /  $O(1,000)$  nodes (T2K, QPACE, GPGPU)
  - Core/CPU/Node Hierarchy exists.
  - Data Bandwidth is not uniform.
  - Data blocking is required at each level.
- 1 ~ 10 PFlops machine trends?
  - My expectation is **Many core/Fat node/ $O(1,000-10,000)$  nodes**
  - Near future: Intel Iarrabee, CELL, GPGPU, .....
  - 200 GFlops/CPU , 8 CPU/node=1.6TF/node, 1,000 node=1.6PFlops
  - 1 TFlops/CPU, 4 CPU/node = 4TF/node, 1,000 node= 4PF

### 3. Algorithmic developments for dynamical QCD

- Recent improvement strategy (HMC)
  - Two key technologies for HMC algorithm

(1) Transform/split  $\det[D]$  using preconditioner (Action Prec.)

UV/IR separation [de Forcrand, Takaishi, NPB(Proc.Suppl.)53,Lat96]

$D$ : Lattice Dirac op.,  $P$ : a preconditioner

choose  $P$  s.t.  $\text{cond}(DP) < \text{cond}(D)$  and easy to compute  $\det[P]$

$$\det[D] = \frac{\det[DP]}{\det[P]}$$

Reduction of condition number of  $D$

remove/suppress UV modes of  $D$

$DP$ : Preconditioned op. IR part/IR physics

$P$ : Preconditioner UV part/UV physics

$$Z = \int \prod dU \det[D] e^{-S[U]} = \int \prod dU \det[DP] \det[P^{-1}] e^{-S[U]}$$

### 3. Algorithmic developments...(cont'd)

- Recent improvement strategy (HMC)

#### (2) Multi time step MD integrator

Multi time step MD integ. [Sexton-Weingarten, NPB 380(92)]

$$\det[DP] \det[P^{-1}] = \int d\Phi_1^+ d\Phi_1 d\Phi_2^+ d\Phi_2 e^{-\Phi_1^+ P \Phi_1 - \Phi_2^+ (DP)^{-1} \Phi_2}$$

HMC partition function

UV mode

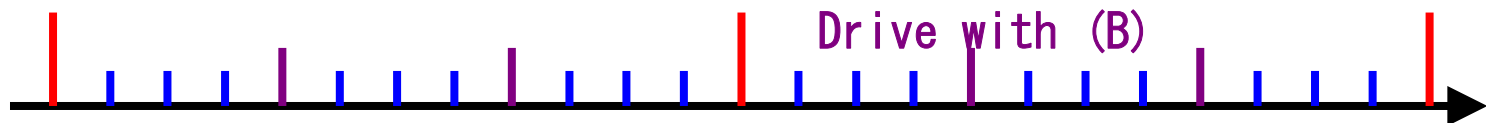
IR mode

$$Z = \int DUDP d\Phi_1^+ d\Phi_1 d\Phi_2^+ d\Phi_2 e^{-H[P,U,\Phi_1,\Phi_2]}$$

$$H = \frac{1}{2} \text{Tr}[\Pi_\mu \Pi_\mu] + S_g[U] + S_1[U, \Phi_1] + S_2[U, \Phi_2]$$

$$\frac{dU_\mu}{d\tau} = i\Pi_\mu U_\mu, \quad \frac{d\Pi_\mu}{d\tau} = F_\mu = F_{g\mu} + F_{q1\mu} + F_{q2\mu} \quad \|F_{g\mu}\| \gg \|F_{q1\mu}\| \gg \|F_{q2\mu}\|$$

Drive with (C)



Drive with (A)

Drive with (B)

$\tau$  : MD time step

### 3. Algorithmic developments...(cont'd)

(1) Transform/split  $\det[D]$  using preconditioner (Action Prec.)

(A) Hasenbusch's heavy mass preconditioner

$$\det[D] = \det[D / D'] \det[D']$$

$D'$  has heavy mass than  $D$ , and  $D / D' \approx 1$

IR mode      UV mode

(B) Geometric preconditioner (Domain Decomposition)

[Lüscher, JHEP 0305 '03, CPC 165 '05]

$$\det[D] = \det \begin{pmatrix} D_{ee} & 0 \\ 0 & D_{oo} \end{pmatrix} \det \begin{pmatrix} 1 & D_{ee}^{-1} D_{eo} \\ D_{oo}^{-1} D_{oe} & 1 \end{pmatrix} = \det[D_{ee}] \det[D_{oo}] \det[1 - D_{ee}^{-1} D_{eo} D_{oo}^{-1} D_{oe}]$$

$$= \det[D_{ee}] \det[D_{oo}] \det[\hat{D}_{ee}]$$

$\hat{D}_{ee}$  : Schur complement of  $D$

UV mode      IR mode

- ILU preconditioning

[M. Peardon, hep-lat/0011080]

- Point / stripe blocking for MG solver, Overlap kernel

[A. Boriçi, hep-lat/0704.2341; LAT2007]<sub>16</sub>



### 3. Algorithmic developments...(cont'd)

(1) Transform/split  $\det[D]$  using preconditioner (Action Prec.)

(C)  $n$ -th root trick and Rational approximation RHMC

[M.Clark, Ph. de Forcrand, A. Kennedy, LAT2005;  
M. Clark, A.Kennedy, PRL98(2007), PRD75(2007)]

$$\det[D^\dagger D] = \det[M] = (\det[M^{1/n}])^n$$

$$Action = \sum_{j=1}^n \phi_j^\dagger M^{-1/n} \phi_j$$

$$\boxed{M^{1/n}} \quad \text{UV mode suppressed}$$

$$Action = \phi^\dagger M^{-1/n} \phi = \sum_{j=1}^p \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi$$

Partial fraction form

$$M^{-1/n} = \sum_{j=1}^p \frac{\alpha_j}{M + \beta_j}$$

$$= \sum_{j=\text{UVpole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi + \sum_{j=\text{IRpole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi$$

UV mode: large  $\beta$  shift.  
Large MD Force, small cost

IR mode: small  $\beta$  shift.  
Small MD Force, expensive cost

Distinctive feature: Implicit scale splitting by Rational Approx.

### 3. Algorithmic developments...(cont'd)

## (2) MD integrator improvements

- Omelyan integrator

[Takaishi & de Forcrand, PRE73(2006);  
Omelyan, Mryglod & Folk, CPC151(2003)]

$Q(\delta t)(p, q) = (p, q + \delta t \cdot p) : \text{evolve } q.$

$P(\delta t)(p, q) = (p + \delta t \cdot F, q) : \text{evolve } p.$

$$\exp(t\hat{L}_H) \approx \left[ Q\left(\frac{\lambda t}{n}\right) P\left(\frac{t}{2n}\right) Q\left(\frac{(1-2\lambda)t}{n}\right) P\left(\frac{t}{2n}\right) Q\left(\frac{\lambda t}{n}\right) \right]^n = \exp(t\hat{L}_{H'})$$

Shadow Hamiltonian  $H'$  (via Baker-Campbell-Hausdorff formula)

$$H' = H + (\alpha \{T, \{T, V\}\} + \beta \{V, \{T, V\}\})\delta t^2 + O(\delta t^4)$$

$$\alpha = \frac{6\lambda^2 - 6\lambda + 1}{12}, \quad \beta = \frac{1 - 6\lambda}{24}$$

- Omelyan et al. minimize  $\alpha^2 + \beta^2$

$$\lambda_{omelyan} = 0.19318332.....$$

Omelyan integrator /  
2<sup>nd</sup> order Minimum Norm integrator (2MN)

50% improvement is observed for QCD (Takaishi & de Forcrand)

### 3. Algorithmic developments...(cont'd)

#### (2) MD integrator improvements

##### ○ Extension to Multiple time step integrator for Omelyan

- Nesting the Kernel (QPQPQ),  $K$ -time scale (depth  $K$ )

$$\exp(t\hat{L}_H) \approx U_{K-1}(t, (n_0, n_1, \dots, n_{K-1}))$$

$$U_j(t, (n_0, \dots, n_j)) = \left[ U_{j-1}\left(\frac{\lambda_j t}{n_j}, (n_0, \dots, n_{j-1})\right) P_j\left(\frac{t}{2n_j}\right) U_{j-1}\left(\frac{(1-2\lambda_j)t}{n_j}, (n_0, \dots, n_{j-1})\right) P_j\left(\frac{t}{2n_j}\right) U_{j-1}\left(\frac{\lambda_j t}{n_j}, (n_0, \dots, n_{j-1})\right) \right]^{n_j}$$

- Recursively defined.

RBC+UKQCD, BMW, QCDSF, ...

$$j = 0, 1, 2, \dots, K-1,$$

$\lambda_j$  : tunable parameters

##### ○ Optimize / Customize your MD integrator

- Shadow Hamiltonian contains errors expressed with Poisson brackets.

- Offline measurement of Poisson brackets;  
exp. val.  $\langle \{A, \{B, \{\dots\}\}\} \rangle$

Takaishi & de Forcrand, PRE73 (2006);

Clark & Kennedy, LAT2007;

Poster by Kennedy

- Minimize the errors by tuning integration parameter,  $\lambda$ , number of time scale, number of pseudo-fermions, ... etc.

### 3. Algorithmic developments...(cont'd)

- Combination of the UV/IR mode separation and the Multiple time scale MD integrator is now common technique.
- There still remains the room to improve
  - UV/IR separation
    - Blocking, Rational Approx, Preconditioner ....
    - Low / IR mode : reweighting / Noisy Metropolis ....
  - MD integrator
    - Omelyan + Multiple time scale
    - Custom made MD integrator

### 3. Algorithmic developments...(cont'd)

## ● Solver Improvements

### (1) Mixed Precision / inner-outer solver

- Single precision : **effectively doubles memory band width, data cache size, register size.**
- Efficiency: S.P. > D.P. Case, mixed prec. is important.
- Intel 64/AMD 64; Single prec. > Double prec.
- Cell PS3/GPGPU; Single >> Double.

### (2) Deflation Technique

- Remove / suppress small eigenvalues. Better solver behavior
- Luscher's local coherency for low modes. RG blocking like deflation.

### (3) Multi Grid solver

- Adoptive Multi Grid (RG blocking) solver/preconditioner

### 3. Algorithmic developments...(cont'd)

#### (1) Mixed precision / Inner-Outer solver

##### Flexible Preconditioner

- Any iterative solver for  $Ax=b$ . (short recurrence solver)

[ $r$  and  $x$  satisfy  $r = b - Ax$ .]

[given a scalar " $\alpha$ " and a pre-search vector " $p$ ".]

$$q = Ap$$

$$r = r - \alpha q$$

$$x = x + \alpha p$$

[new  $r$  and  $x$  still satisfy  $r = b - Ax$ .]

- Accumulated  $r$  and  $x$  should satisfy  $r=b-Ax$  at each update point.
- To make flexible precondition, modify the update lines as

### 3. Algorithmic developments...(cont'd)

#### (1) Mixed precision / Inner-Outer solver

○ *Right preconditioning* ;  $AMy = b$ ;  $x = My$ .

[ $r$  and  $x$  satisfy  $r = b - Ax$ .]

[given a scalar " $\alpha$ " and a pre-search vector " $p$ ".]

$$v = Mp$$

$$q = Av \quad (= AMp : \text{ search vector for } AMy = b)$$

$$r = r - \alpha q$$

$$x = x + \alpha v$$

[new  $r$  and  $x$  still satisfy  $r = b - Ax$ .]

- Search vector is computed for  $AMy=b$ .
- The solution-residual relation is kept for  $r=b-Ax$  *locally*.
- This enables us to change  $M$  from iteration to iteration (*Flexible preconditioner*).
- Put *inner solver* for  $M \approx A^{-1}$
- $M$  can be *single precision*.  $r=b-Ax$  is kept in *double precision*.

### 3. Algorithmic developments...(cont'd)

#### (1) Mixed precision / Inner-Outer solver

○ CG, BiCGStab, CGS, ....., can be flexible.

- The most simple case : Richardson / Iterative refinement. [Numerical Recipes]
  - BMW collab. uses D.P. Richardson for outer-solver + S.P. CG for inner-solver [BMW collab., Dürr et al., hep-lat/0802.2706]
  - PACS-CS: uses D.P. BiCGStab+ S.P. BiCGStab

○ For Arnoldi type solver [GMRES, GCR...]

- Longer recurrence relation
- Keep a series of intermediate vectors (like  $v$  in prev. page.)
- Then FGMRES, GCR(Lüscher) can be flexible.

This is already common to  
Overlap fermions?  
Low prec. sign func. (inner)  
+ High prec. sign func. (outer)

○ By tuning solver parameters

- Most Time is spent in (inner) single precision arithmetic.
- If the single precision kernel has much better performance than that with double precision kernel.
- **Best performance** is obtained with mixed precision solver.
- **Promising for GPGPU / CELL computing!!**



### 3. Algorithmic developments...(cont'd)

## (2) Deflation technique

- Critical Slowing down of Solver iteration is caused by small / near zero eigenvalues.
- By subtracting such modes from the matrix spectra, we can recover from the slowing down.
- Deflation technique remove/suppress the near zero eigenspace of  $D$ .

This is already common to  
Overlap fermions (sign function)

### 3. Algorithmic developments...(cont'd)

#### (2) Deflation technique (To Solve:

- Matrix  $A$  has  $p$ -dimensional subspace with small eigenvalues.

Let  $c$  and  $u$  spans the subspace.

$$U_p = (u_1, u_2, \dots, u_p)$$

$$C_p = (c_1, c_2, \dots, c_p)$$

$$AU_p = C_p$$

$$C_p^\dagger C_p = I_p$$

- Suppose the projection operator:

$$P = I_p - C_p C_p^\dagger$$

$$Q = I_p - U_p C_p^\dagger A$$

$$PA = AQ$$

- Then consider the following preconditioned problem.

$$(PA)y = Pb \quad \dots (2)$$

$$Ax = b \quad \dots (1)$$

- The solution  $x$  of Eq.(1) can be written with  $y$  of Eq.(2) as

$$x = Qy + U_p C_p^\dagger b$$

$$\because Ax = AQy + AU_p C_p^\dagger b$$

$$= PAy + C_p C_p^\dagger b$$

$$= Pb + C_p C_p^\dagger b = b$$

- Solving Eq.(2) is easier than solving Eq.(1), because the coefficient matrix of Eq.(2)  $PA$  does not contain small eigenvalues.
- If the cost to obtain  $C$  and  $U$  is small, deflation improves solver performance.
- How to construct the subspace " $C_p$ "?

### 3. Algorithmic developments...(cont'd)

#### (2) Deflation technique (cont'd)

Many works by

[Luescher, JHEP07(2007),hep-lat/0710.5417;  
A.Stathopoulos, K.Orginos, hep-lat/0707.0131;  
W.Wilcox, PoS(LATTICE2007),hep-lat/0710.1813;  
A.Abdel-Rehim,R.B.Morgan,W.Wilcox,PoS(LATTICE2007);  
R.B.Morgan,W.Wilcox,math-ph/0707.0505,math-ph/0405053;  
M.L.Parks, E.De Sturler et al, SIAM J. on Sci.Comp. 28(2006)1651  
LATTICE2008: Poster by Abdel-Rehim, Talk by Wilcox]

More details see Wilcox @Lat2007.

To avoid exact eigen pairs computation

#### (a) Overlap eigen mode computation and $D^{-1}$ computation.

- GMRES-DR,GMRES-E...:Wilcox, Morgan & Abdel-Rehim
- GCRO-DR: Parks & Sturler

These algorithms can solve  $Dx=b$  and eigen pairs simultaneously.

#### (b) Make use of Local coherency property of low modes.

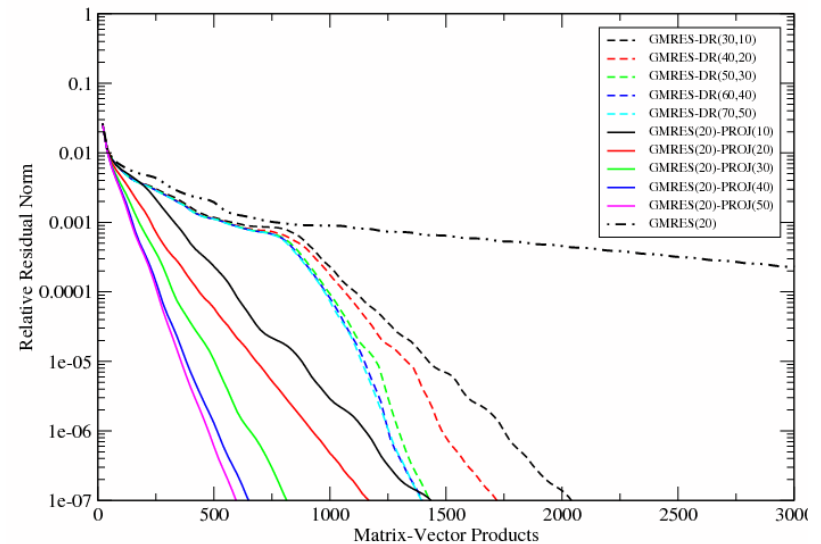
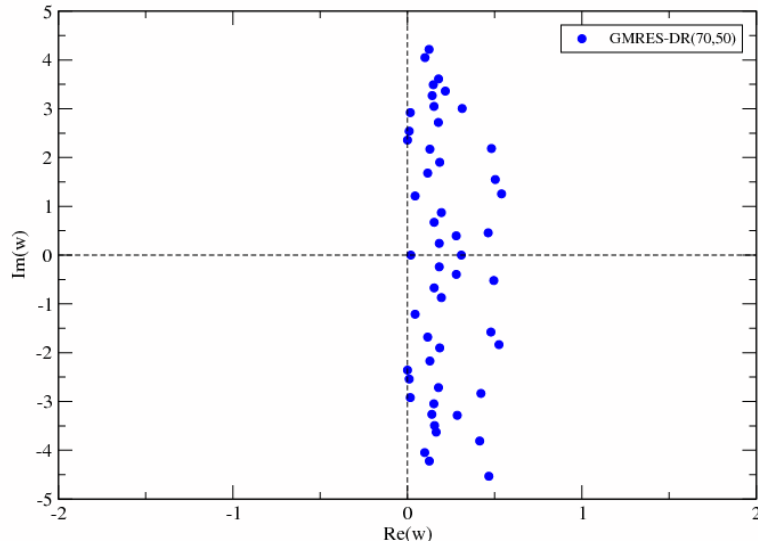
- Luscher's Domain decomposed subspace blocking with local coherency.

### 3. Algorithmic developments...(cont'd)

#### (a) Overlap eigen mode computation and $D^{-1}$ computation.

Very effective for few Near zero modes / negative eigen modes case.

$20^{32}$



- Near zero modes case [Wilcox, LAT2007]
  - First equation or few equations are solved with GMRES-DR. Once the subspace converged, change solver with GMRES-proj, or Deflated solver.
  - Normal GMRES stagnates [dot-dot-dashed line]
  - Solver with Deflation/Projection converges. [other lines]
  - Critical slowing down is avoided.

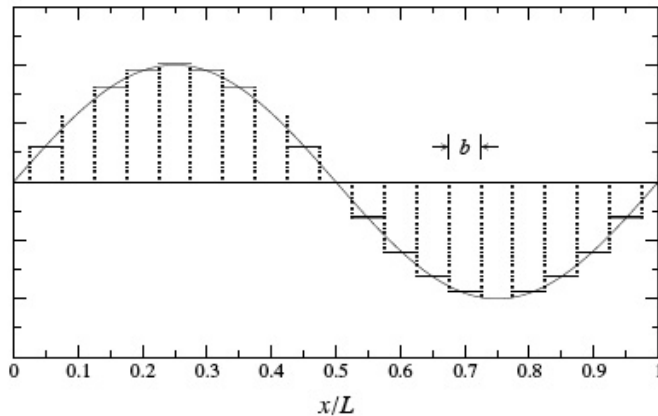
[PACS-CS collab. uses GCRO-DR for inner solver] 28

### 3. Algorithmic developments...(cont'd)

#### (b) Make use of Local coherency property of low modes.

Low modes can be well approximated by few blocked basis vectors  
 [Local coherency].

[Lüscher, JHEP07(2007)081]

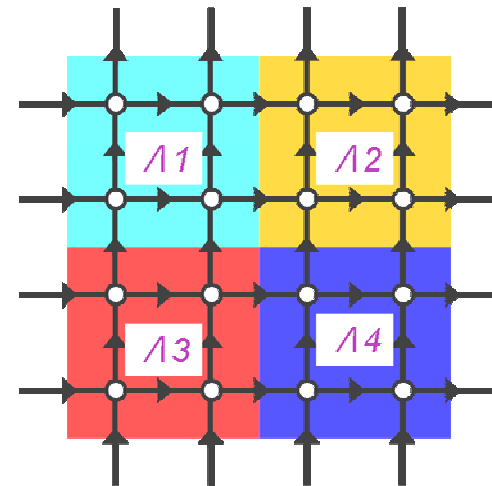


$$\text{a low mode vector } : \psi(x) \approx \sum_{\Lambda}^{\text{blocks}} \sum_{j=1}^N c_{(j,\Lambda)} \phi_j^{\Lambda}(x)$$

$$C = \{ \phi_j^{\Lambda}(x) : j = 1, \dots, N, \Lambda = \text{all domain blocks} \}$$

$$\phi_j^{\Lambda}(x) = \begin{cases} \neq 0 & (x \in \Lambda) \\ = 0 & (x \notin \Lambda) \end{cases}, \quad (\phi_i^{\Lambda})^{\dagger} \cdot \phi_j^{\Lambda'} = \delta_{ij} \delta_{\Lambda\Lambda'}$$

- $\phi$  is constructed after few smoothing processes via inverse iteration on  $N$ -random vectors.
- Then blocked and orthogonalized.  
The subspace dimension is effectively enlarged:  
 $N \times [\text{\#of Lattice blocks}]$
- $C = \{ \phi \}$  spans the deflation subspace.
- Suitable for Domain-Decomposition and Memory efficient.



### 3. Algorithmic developments...(cont'd)

[Lüscher, JHEP07(2007)081]

#### (b) Make use of Local coherency property of low modes.

- Using the Low mode rich subspace  $C$ , the deflation projector is constructed as

$$P = 1 - DCB^{-1}C^\dagger, \quad Q = 1 - CB^{-1}C^\dagger D, \quad B = C^\dagger DC,$$

$$PD = DQ, P^2 = P, Q^2 = Q,$$

This contains  $B$  which is the projection of  $D$  in to the subspace  $C$ .

- For Wilson-Dirac operator, the small Wilson-Dirac operator  $B$  becoms

$$B(i, \Lambda; j, \Lambda') \equiv \langle \phi_i^\Lambda | D | \phi_j^{\Lambda'} \rangle$$
$$= B(i, j, \Lambda) \delta_{\Lambda, \Lambda'} + \sum_{\mu=1}^4 \left[ B(i, j, \Lambda, \mu) \delta_{\Lambda+\hat{\mu}, \Lambda'} + B(i, j, \Lambda, \mu) \delta_{\Lambda-\hat{\mu}, \Lambda'} \right]$$

- Similar to RG blocked W.D.operator. Still has nearest neighbor interaction.
- Using this projection, critical slowing down is avoided.

### 3. Algorithmic developments...(cont'd)

Talk by M. Clark @ this conference.  
 [Brannick, Brower, Clark, Osborn, Rebbi,  
 PRL100(2008);LAT07]

#### (3) MultiGrid Solver

- MultiGrid solver also removes critical slowing down.
- Choice of subspace basis is important. (Prolongator)
- Similar to Luscher's deflation. **Low mode enhancement is important.**

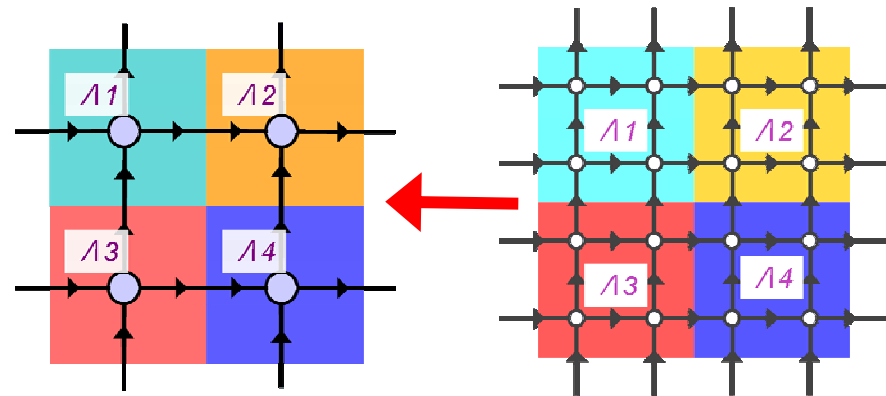
$v_l(x)$ :  $N$  random vector

$$w_l = (D)^{-k} v_l : \text{low mode enhanced}$$

then  $w_l$  is blocked as

$$C = \{ \phi_j^\Lambda(x) : j = 1, \dots, N, \Lambda = \text{all domain blocks} \}$$

$$\phi_j^\Lambda(x) = \begin{cases} \neq 0 & (x \in \Lambda) \\ = 0 & (x \notin \Lambda) \end{cases}, \quad (\phi_i^\Lambda)^\dagger \cdot \phi_j^{\Lambda'} = \delta_{ij} \delta_{\Lambda\Lambda'}$$



- To solve  $Dx = b$ , use the preconditioner defined by

$$P \equiv CB^{-1}C^\dagger \quad \text{with} \quad B \equiv C^\dagger DC, \quad \text{or}$$

$$B(i, \Lambda; j, \Lambda') \equiv \langle \phi_i^\Lambda | D | \phi_j^{\Lambda'} \rangle$$

### 3. Algorithmic developments...(cont'd)

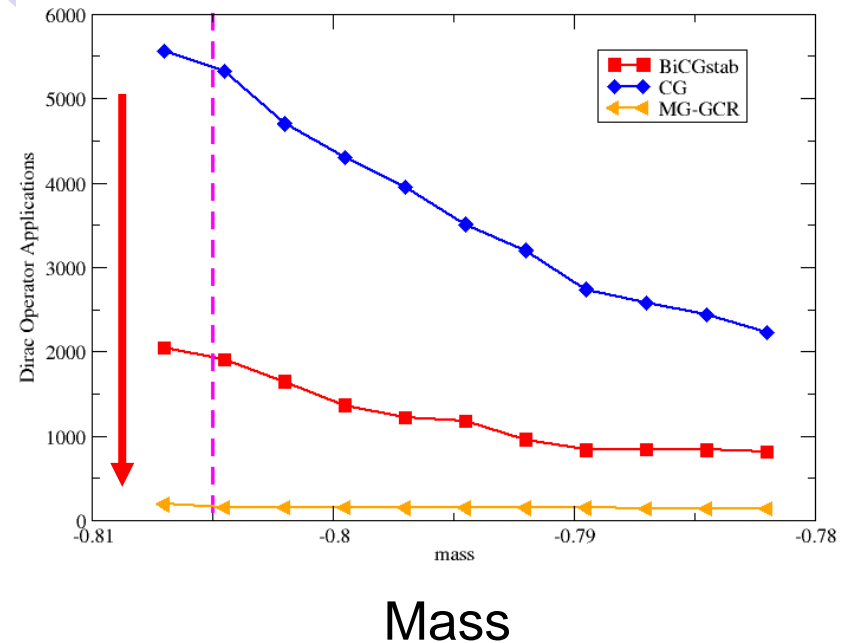
#### (3) MultiGrid Solver (cont'd)

- Then Solve

$$PDx = Pb$$

- $P$  is the approximation of  $D^{-1}$  in the subspace  $C$ .
- $P$  contains  $B^{-1}$ . to solve this next blocking is applicable.
- Recursively applying this blocking.  
⇒ MultiGrid. V cycle
- Similar to Luscher's deflation subspace blocking. **Low mode enhancement is important.**

No critical slowing down



QCD  $16^3 \times 32$  Wilson Case  
Talk by M. Clark @ this conference.  
[Brannick, Brower, Clark, Osborn, Rebbi,  
PRL100(2008);LAT07]

Another RG blocking by A. Borici, hep-lat/0704.2341; LAT2007.



### 3. Algorithmic developments...(cont'd)

Solver Works in this conference:

- J.Bloch (for Overlap fermion) [Mon. Chesapeake C],
- J.Osbon (Initial guess for multi-shift solv.) [Mon. Chesapeake C]
- W.Wilcox (Deflation/Lanczos/multiple) [Mon. Chesapeake C]
- A.Abdel-Rehim (Seed method/multiple) [Poster S.A]

- Mixed precision solver effectively enhances the solver performance.
  - application to GPGPU/CELL?
- Deflation and MultiGrid blocking with low mode-rich basis vector removes Critical slowing down.

### 3. Algorithmic developments...(cont'd)

Algorithm works in this conference:

[July 15, Tue. Chesapeake B]

- A. Bazavov (for HISQ action dynamical sim.)
- R.C. Brower (Mobius Algorithm for DW/GapDW fermion.)
- M. Clark (Remove Critical Slowing down)
- T. Kruth (Dynamically Smeared Fermions)

[July 16, Wed. Chesapeake B]

- O. Witzel (Polynomial HMC)
- R. Renfrew (Reduce Ch.Sym.breaking for DW)
- F. Palombi (Reweighting for Low mode Quark determinant)
- W. Cherrington (Dual Lattice Algorithm)
- J. Mucci (SiCortex Machines)

[July 15, Tue. Poster session]

- A. Pochinsky (Efficient QCD code made simpler: qa0)
- L. Piccoli (Tracking QCD workflows)
- G. von Hippel (Petrurbative imp. with HISQ fermions)

# 4. Outlook: Physics at 1PFlops

- Dynamical QCD simulation at 1 PFlops

- Physical quark masses ( $M_{ud} < 10 \text{ MeV}$ ,  $L=3\text{fm}$ ,  $a=0.1\text{fm}$ )

- Cost  $O(10)$  Tflops Years Wilson/KS type

[ALPHA,BMW,CERN,ETM,JLAB,PACS-CS,QCDSF,MILC,..]

- $O(100)$  Tflops Years? Overlap/DW type

[UKQCD/RBC,JLQCD/TWQCD,SESAM/QCDSF,..]

- Finer lattice spacing ( $1/a > 6 \text{ GeV}$ ?,  $L=2\text{fm}$ ,  $64^3 \times 128$  lattice)

- Charm quarks

$$\Lambda_{QCD} \approx 0.3\text{GeV} < m_{charm} \approx 1.5\text{GeV} < 1/a \approx 6\text{GeV}$$

$$1/\Lambda_{QCD} \approx 0.6\text{fm} > 1/m_{charm} \approx 0.13\text{fm} > a \approx 0.03\text{fm}$$

- Continuum limit

$$(am_c)^2 \approx (1.5/6)^2 = 0.06 \quad (6\% \text{ error})$$

- Larger lattice volume ( $L > 6 \text{ fm}$ ?,  $1/a=2\text{GeV}$ ,  $64^3 \times 128$  lattice)

- Multi hadron system

$$m_\pi \approx 0.1\text{GeV} < \Lambda_{QCD} \approx 0.3\text{GeV} < 1/a \approx 2\text{GeV}$$

$$1/m_\pi \approx 2\text{fm} > 1/\Lambda_{QCD} \approx 0.6\text{fm} > a \approx 0.1\text{fm}$$

**Multi scale physics**

#### 4. Outlook: Physics at 1PFlops

- Dynamical QCD simulation at 1 PFlops

- Empirical cost formula

$$\text{Cost[TFlopsYears]} = C \left[ \frac{\#\text{Conf}}{100} \right] \cdot \left[ \frac{20\text{MeV}}{\bar{m}_q} \right]^3 \cdot \left[ \frac{L}{3\text{fm}} \right]^5 \cdot \left[ \frac{0.1\text{fm}}{a} \right]^7$$

[Ukawa, Lat2001 @ Berlin]

$$\text{Cost[TFlopsYears]} = K \left[ \frac{\#\text{Conf}}{100} \right] \cdot \left[ \frac{20\text{MeV}}{\bar{m}_q} \right]^1 \cdot \left[ \frac{L}{3\text{fm}} \right]^5 \cdot \left[ \frac{0.1\text{fm}}{a} \right]^6$$

[DDHMC: Del Debbio et al..JHEP0702(2007)056]

- Now O(10)TFlopsYears for  $M_\pi/M_\rho \approx 0.2$  at  $a \approx 0.1\text{fm}$ ,  $L \approx 3\text{fm}$

[Talk by Kuramashi, PACS-CS]

- Finer lattice spacing ( $1/a > 6 \text{ GeV}$ ?,  $L=2\text{fm}$ ,  $64^3 \times 128$  lattice)

- Charm quark on fine lattice requires  $a=0.03 \text{ fm}$  lattice.

The Cost is  $(2/3)^5 \cdot 3^6 = 96$  larger.  $\Rightarrow$  O(1) Pflops Years is required.

- Still difficult problem?  $\Rightarrow$  10PFlops problem.

- Larger lattice volume ( $L > 6 \text{ fm}$ ?,  $1/a=2\text{GeV}$ ,  $64^3 \times 128$  lattice)

- Multi hadron system by doubling the lattice extent.

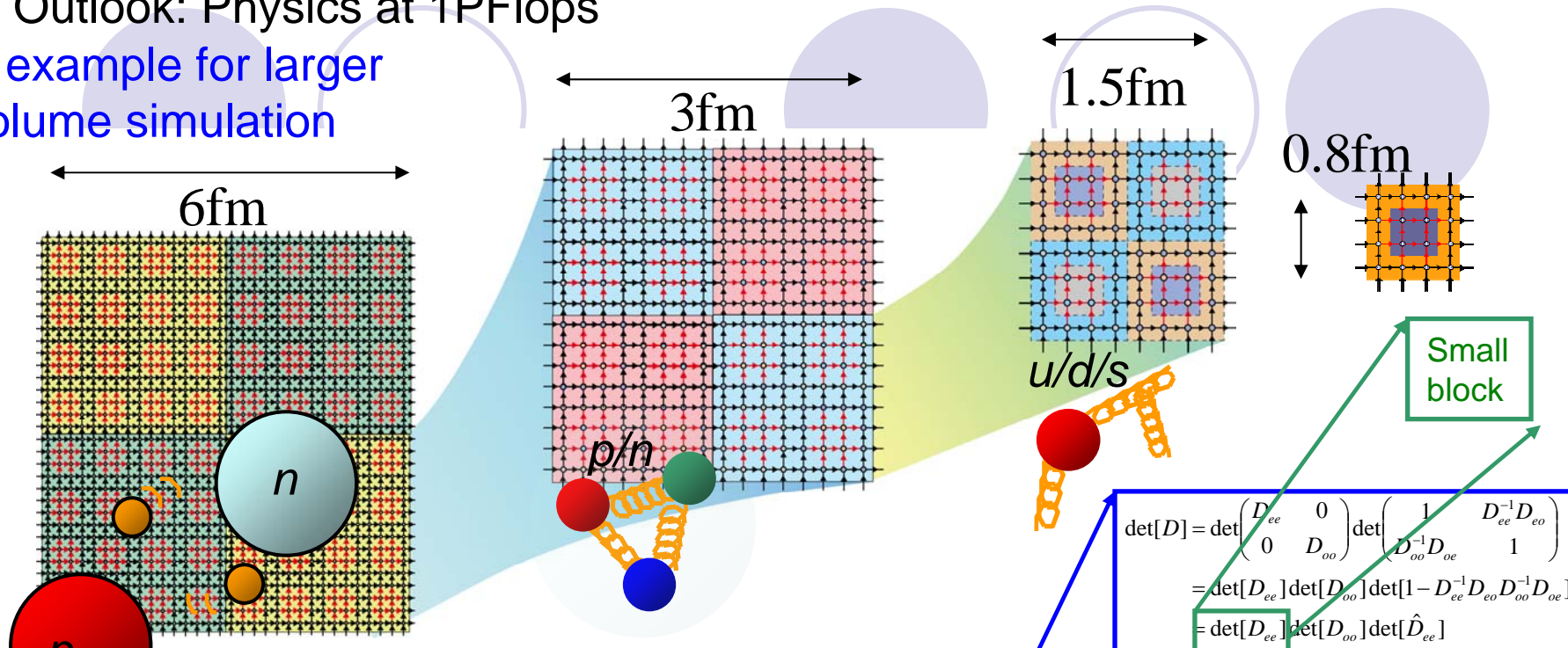
The Cost is  $2^5 = 32$  larger.  $\Rightarrow$  O(300) Tflops Years is required.

30% sustained speed with 1 PFlops peak speed machine can handle this problem.

[Wilson/KS type]

# 4. Outlook: Physics at 1PFlops

A example for larger volume simulation



$$\det[D] = \det \begin{pmatrix} D_{ee} & 0 \\ 0 & D_{oo} \end{pmatrix} \det \begin{pmatrix} 1 & D_{ee}^{-1} D_{eo} \\ D_{oo}^{-1} D_{oe} & 1 \end{pmatrix}$$

$$= \det[D_{ee}] \det[D_{oo}] \det[1 - D_{ee}^{-1} D_{eo} D_{oo}^{-1} D_{oe}]$$

$$= \det[D_{ee}] \det[D_{oo}] \det[\hat{D}_{ee}]$$

$$\det[D] = \det \begin{pmatrix} D_{ee} & 0 \\ 0 & D_{oo} \end{pmatrix} \det \begin{pmatrix} 1 & D_{ee}^{-1} D_{eo} \\ D_{oo}^{-1} D_{oe} & 1 \end{pmatrix}$$

$$= \det[D_{ee}] \det[D_{oo}] \det[1 - D_{ee}^{-1} D_{eo} D_{oo}^{-1} D_{oe}]$$

$$= \det[D_{ee}] \det[D_{oo}] \det[\hat{D}_{ee}]$$

$$\det[D] = \det \begin{pmatrix} D_{ee} & 0 \\ 0 & D_{oo} \end{pmatrix} \det \begin{pmatrix} 1 & D_{ee}^{-1} D_{eo} \\ D_{oo}^{-1} D_{oe} & 1 \end{pmatrix}$$

$$= \det[D_{ee}] \det[D_{oo}] \det[1 - D_{ee}^{-1} D_{eo} D_{oo}^{-1} D_{oe}]$$

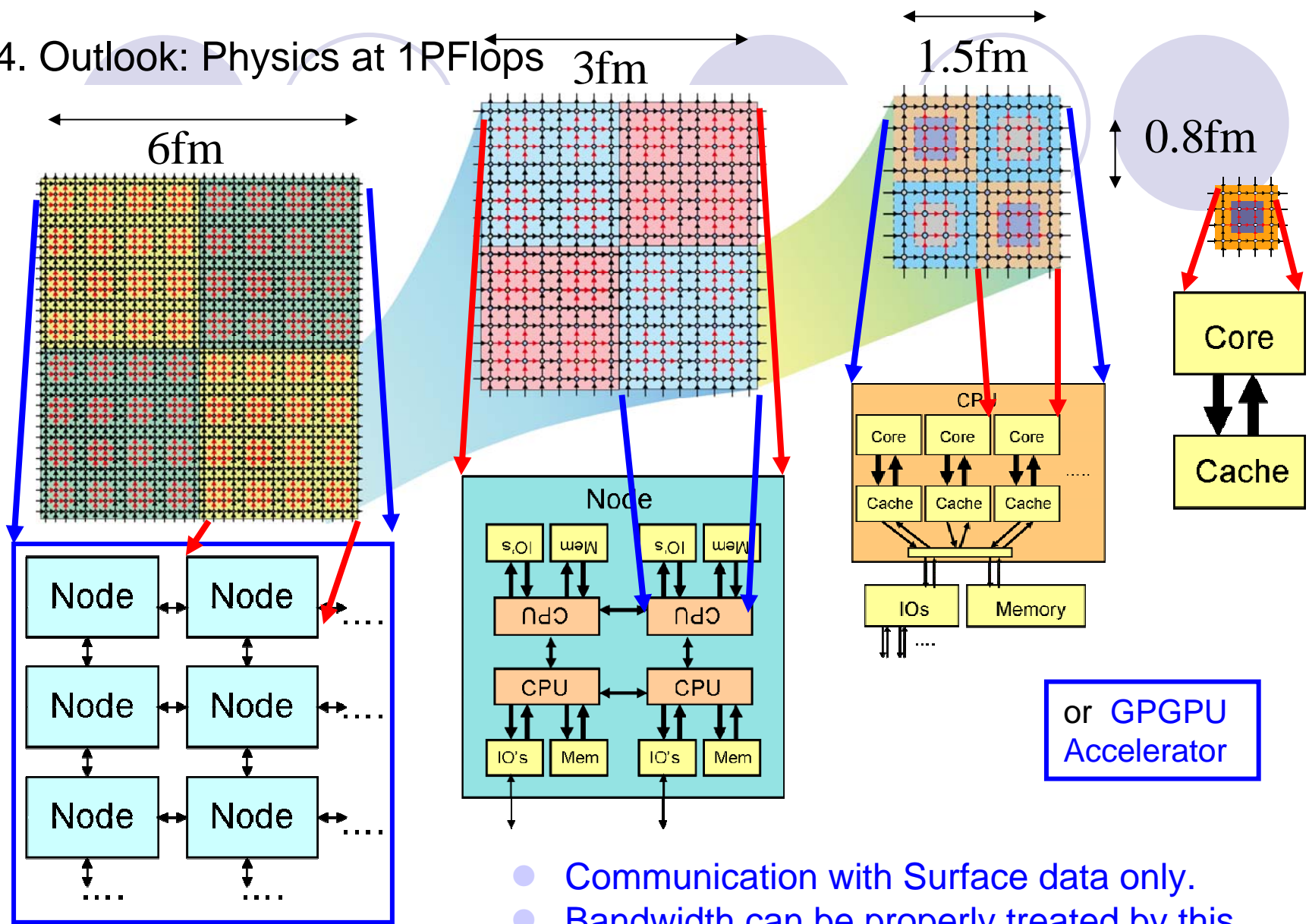
$$= \det[D_{ee}] \det[D_{oo}] \det[\hat{D}_{ee}]$$

(  $L > 6$  fm?,  $1/a=2\text{GeV}$ ,  $64^3 \times 128$  lattice)

● Nested Domain Decomposition

+Some Improvement technology. <sup>37</sup>

#### 4. Outlook: Physics at 1PFlops 3fm



- Communication with Surface data only.
- Bandwidth can be properly treated by this blocking.
- But Latency is limited by speed of light.

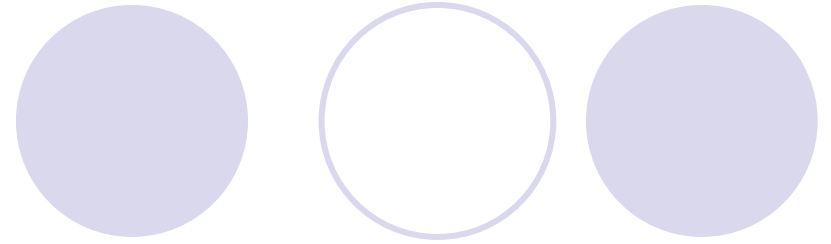


# 5. Summary

- Machine trends
  - Multi core architecture is the trend.
  - GPGPU has better cost performance, but actual application for LQCD is now beginning. Large scale simulation is still missing.
  - CELL becomes common architecture for HPC?
- Algorithm
  - UV/IR separation + multiple time step MD is common.
  - Deflation and MG remove critical slowing down.
- Physics at 1 PFlops
  - Large volume simulation for multi hadron system can be a target. [Multi scale physics]
  - To tread Multi scale physics, the structure of machine architecture should be taken account.

That's all Thank you!

Backup slides





## 4. Outlook: Physics at 1PFlops

- Wilson/KS type fermion can handle multi-hadron system with 1PFlops machine in principle.
- Whole System performance analysis that has been done, for ex. QCDOC, CP-PACS, APE...., is *again* required.
- Domain-Wall / Overlap fermion : Are there this kind of decomposition ?
- D.W. / 5D-rep. Overlap can use geometric preconditioner.
- 4D-Overlap requires special kernel for geometric decomposition?
  - Dirichlet boundary condition for OV op. [Luscher, "Shrodinger Functional with exact Chiral symmetry", JHEP 0605 (2006) 042]
  - Enormous works for Dynamical Overlap/DW fermions [Many people ,RBC,QCDSF,SESAM,JLQCD,.....]
- QCD Software / infrastructure works [MILC code; ILDG; B.Joo,USQCD; A.Borici,QCDLAB; ...]

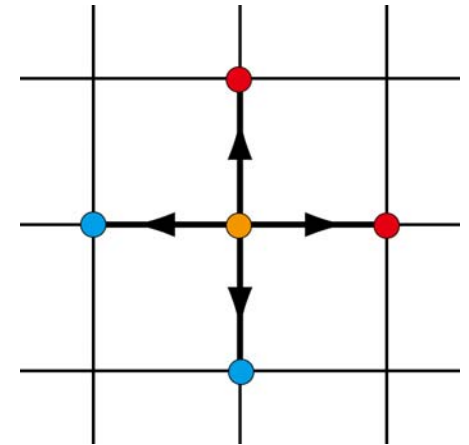
That's all Thank you!

## 2. Machine Trends (cont'd)

- For QCD (dynamical)
  - Hybrid Monte Carlo (HMC)
  - Dynamical Quark part requires huge amount of hopping matrix multiplication.

$$M(n, m) = \sum_{\mu=1}^4 \left[ (1 - \gamma_{\mu}) U_{\mu}(n) \delta_{n+\hat{\mu}, m} + (1 + \gamma_{\mu}) U_{\mu}^{\dagger}(m) \delta_{n-\hat{\mu}, m} \right]$$

- This computation requires  
~ 3 Byte/Flop for a site...



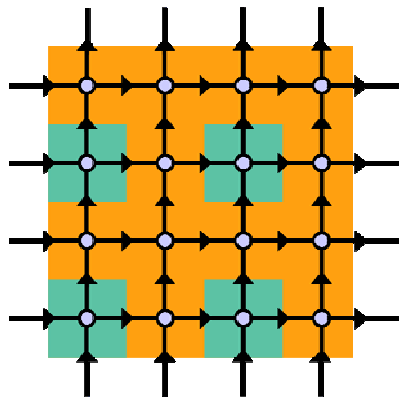
Register, Cache, are memory blocking are required at each layer.

### 3. Algorithmic developments...(cont'd)

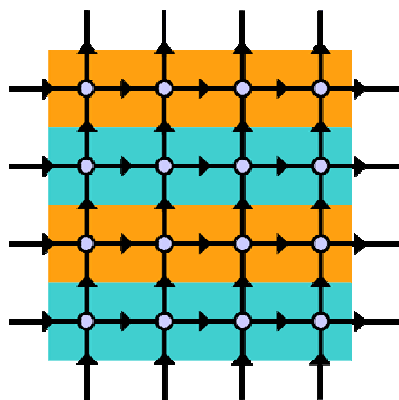
(1) Transform/split  $\det[D]$  using preconditioner (Action Prec.)

(b') Point / stripe (RG) blocking for MG solver, Overlap kernel

[A. Borici, hep-lat/0704.2341; LAT2007]



type1



type2

Change Site Ordering

$$\det[D] = \det \begin{pmatrix} D_{bb} & D_{br} \\ D_{rb} & D_{rr} \end{pmatrix}$$

$$= \det[D_{rr}] \det[D_{bb} - D_{br} D_{rr}^{-1} D_{rb}]$$

$$= \det[D_{rr}] \det[S_{bb}]$$

UV mode

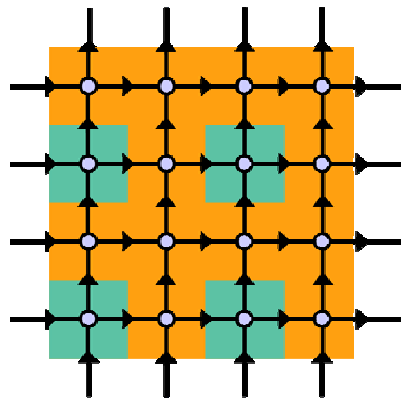
IR mode

$S_{bb}$  : Schur complement of D

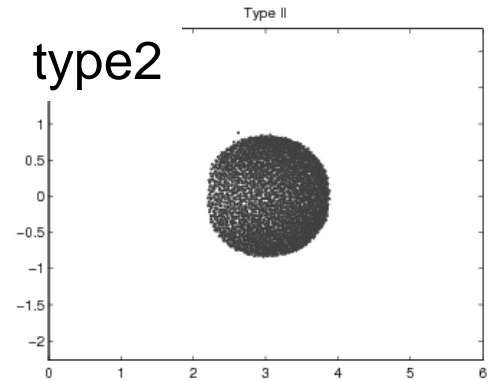
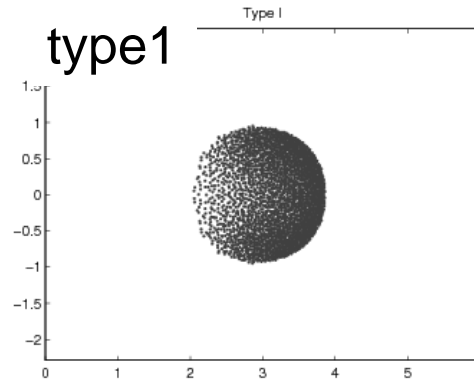
### 3. Algorithmic developments...(cont'd)

(b') Point / stripe (RG) blocking for MG solver, Overlap kernel

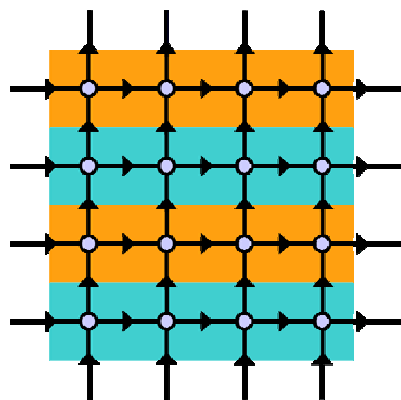
[A.Borici, hep-lat/0704.2341; LAT2007]



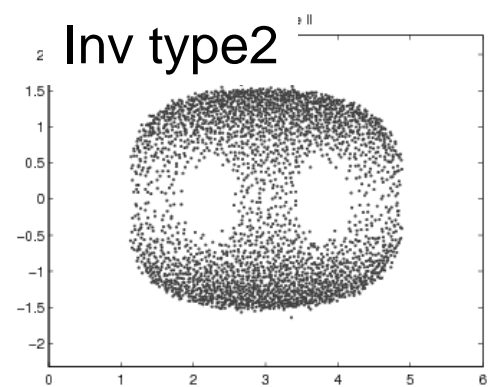
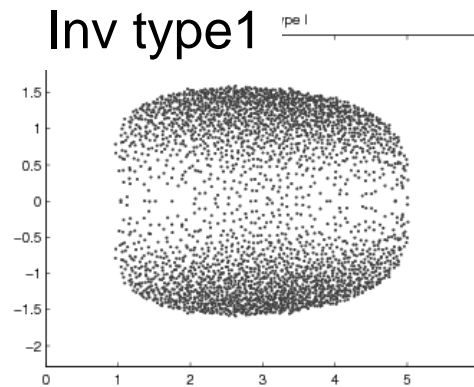
$S_{bb}$



type1



type2



$\beta = 5.4, 8^4$  lattice

### 3. Algorithmic developments...(cont'd)

#### (c) $n$ -th root trick and Rational approximation RHMC

##### ○ Rational approximation

- C.f. Multi boson algorithm

- Hermitian Polynomial approx. (Luscher '93)

- Non-Hermitian Polynomial approx. (Borrelli, de Forcrand, Galli '96)

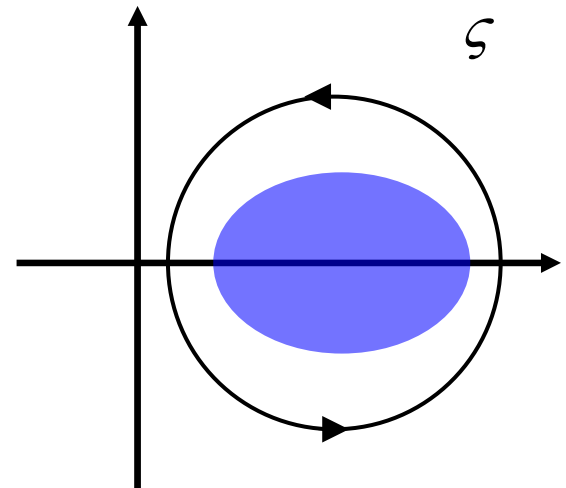
$$1/x \approx \sum_j c_j x^j$$

For RHMC algorithm, similar variant is possible.

- Hermitian Rational approx. VS Non-Hermitian Rational approx.

$$D^{-1/n} = \frac{1}{2\pi i} \oint \zeta^{-1/n} (\zeta - D)^{-1} d\zeta$$
$$\approx \sum_j (\zeta_j)^{-1/n} (\zeta_j - D)^{-1} d\zeta_j$$

$D$ : Non - Hermitian Wilson Dirac op.



### 3. Algorithmic developments...(cont'd)

## (2) MD integrator improvements

- Omelyan integrator
- Simple leapfrog

[Takaishi & de Forcrand, PRE73(2006);  
Omelyan, Mryglod & Folk, CPC151(2003)]

$H(p, q) = T(p) + V(q)$ , : Hamiltonian

$$\begin{pmatrix} p(t) \\ q(t) \end{pmatrix} = \exp(t\hat{L}_H) \begin{pmatrix} p(0) \\ q(0) \end{pmatrix}$$

$$\exp(t\hat{L}_H) \approx \left[ Q\left(\frac{t}{2n}\right) P\left(\frac{t}{n}\right) Q\left(\frac{t}{2n}\right) \right]^n$$

$$\hat{L}_H X \equiv \{X, H\} = \frac{\partial X}{\partial q} \frac{\partial H}{\partial p} - \frac{\partial H}{\partial q} \frac{\partial X}{\partial p}$$

$Q(t) \equiv \exp(t\hat{L}_T)$  : evolve  $q$ .

$P(t) \equiv \exp(t\hat{L}_V)$  : evolve  $p$ .

Leapfrog integrator

- This operator does not conserve  $H$ , but conserves **Shadow Hamiltonian  $H'$** .

$$\left[ Q\left(\frac{t}{2n}\right) P\left(\frac{t}{n}\right) Q\left(\frac{t}{2n}\right) \right]^n = \exp(t\underline{\hat{L}}_{H'})$$

Exact rel.

**Shadow Hamiltonian:**  $H' = H - \frac{1}{24} (\{T, \{T, V\}\} + 2\{V, \{T, V\}\}) \delta t^2 + O(\delta t^4)$

### 3. Algorithmic developments...(cont'd)

#### (2) Deflation technique

- LQCD requires thousand of linear equation solution

$$Dx^{(i)} = b^{(i)}, i = 1, 2, 3 \dots$$

$$D^{(i)}x^{(i)} = b^{(i)}, i = 1, 2, 3 \dots, D^{(i)} \approx D^{(i-1)},$$

- Multiple right-hand side or chain of linear equations.
  - Quark propagator
  - Solver in HMC trajectory
- The reduction of condition number of coefficient matrix  $D$  is very effective. Efficient Preconditioning is desired.
- Deflation technique is one of the efficient technique to reduce the condition number.
  - Deflation remove/suppress small eigenspace of  $D$ .

### 3. Algorithmic developments...(cont'd)

#### (2) Deflation technique (cont'd)

##### (a) Overlap eigen mode computation and $D^{-1}$ computation.

Use Arnoldi type Solver [Krylov subspace method] for  $Ax=b$ .

$r = b - Ax_0$ : initial residual

$v_0 = r / |r|$ ,

$AV_K = V_{K+1} \bar{H}_K$ : Arnoldi factorization (via Gram - Schmidt).

$V_{K+1} = (v_0, v_1, \dots, v_{K+1})$ ,  $v_i^\dagger v_j = \delta_{ij}$ , Krylov subspace basis.

$\bar{H}_K$ : upper Hessenberg matrix ( $K+1 \times K$ )

$x = x_0 + V_{K+1}c$ , where  $c^T = (c_0, c_1, \dots, c_{K+1})$

Minimize:  $|r| = |b - Ax|$  with  $c$ .

GMRES(K)

- $V_{K+1}$  and  $H_K$  contains the spectrum info. of  $A$ .
- At restarting, construct Harmonic-Ritz pairs.

Solve small eigen problem ( $K \times K$ )

$$(\bar{H}_K^\dagger \bar{H}_K - \mu H_K^\dagger) y = 0$$

GMRES-DR/GCRO-DR

Harmonic Ritz pair  $(\mu, w = V_K y)$  is approximation for  $(A - \mu)w = 0$ .

Few  $\{w\}$  basis vectors are recycled as deflation subspace for the next iteration.

Reduce eigen mode comp. cost



### 3. Algorithmic developments...(cont'd)

[Lüscher, JHEP07(2007)081]

#### (b) Make use of Local coherency property of low modes.

- Deflation projector contains small linear equation  $B^{-1}$ .

$$P = 1 - DCB^{-1}C^\dagger, \quad Q = 1 - CB^{-1}C^\dagger D, \quad B = C^\dagger DC,$$

$$PD = DQ, P^2 = P, Q^2 = Q,$$

- For Wilson-Dirac operator, the small Wilson-Dirac operator  $B$  becomes

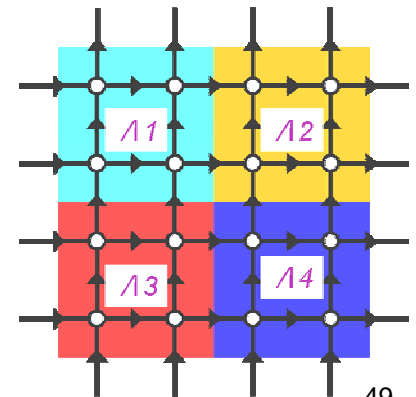
$$B(i, \Lambda; j, \Lambda') \equiv (\phi_i^\Lambda)^\dagger \cdot (D\phi_j^{\Lambda'})$$

$$= B(i, j, \Lambda)\delta_{\Lambda, \Lambda'} + \sum_{\mu=1}^4 \left[ B(i, j, \Lambda, \mu)\delta_{\Lambda+\hat{\mu}, \Lambda'} + B(i, j, \Lambda, \mu)\delta_{\Lambda-\hat{\mu}, \Lambda'} \right]$$

- Similar to RG blocked W.D.operator. Still has nearest neighbor interaction.
- To avoid frequent application of Projection,  $P$  is applied to SAP preconditioned problem:

$$DM_{SAP}y = b, x = M_{SAP}y,$$

$$\Rightarrow PDM_{SAP}y = Pb, x = QM_{SAP}y + CB^{-1}C^\dagger b.$$

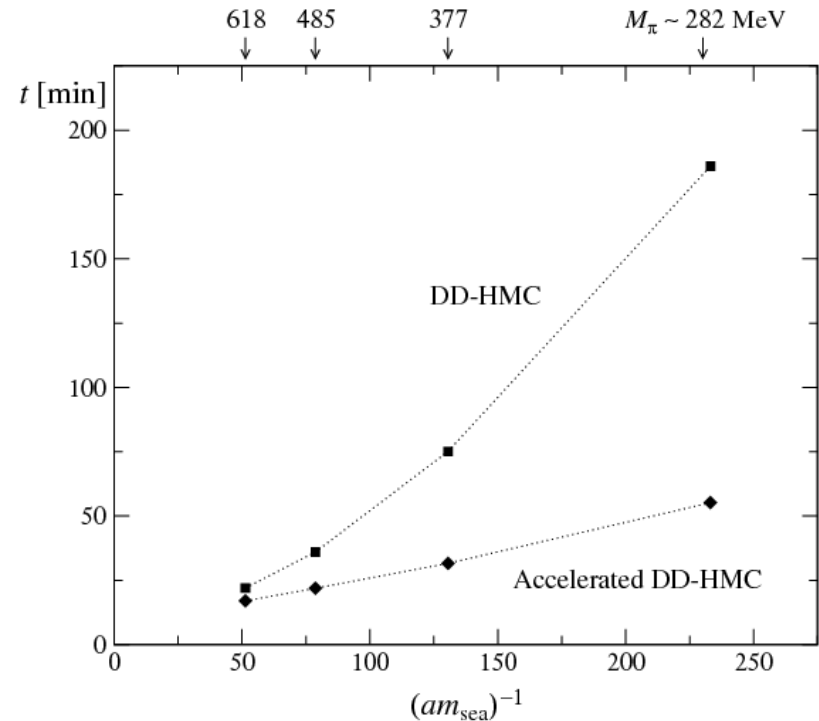


### 3. Algorithmic developments...(cont'd)

[Lüscher, hep-lat/0710.5417]

#### (b) Make use of Local coherency property of low modes.

- Deflation accelerates DDHMC performance
- Factor 2-3 improvement is observed.
- Speedup is significant for smaller quark masses.



Deflation removes critical slowing down.

### 3. Algorithmic developments...(cont'd)

#### (c) $n$ -th root trick and Rational approximation RHMC

Further cost reduction using Rational approximation

$$M^{-1/n} = \sum_{j=1}^p \frac{\alpha_j}{M + \beta_j}$$

M: Hermitian, spectrum boundary is known.  
 $\alpha, \beta$  : real parameter  
Optimal Chebyshev approx.

$$\text{Action} = \phi^\dagger M^{-1/n} \phi = \sum_{j=1}^p \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi$$

Partial fraction form

$$= \underbrace{\sum_{j=\text{UVpole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi}_{\text{UV mode}} + \underbrace{\sum_{j=\text{IRpole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi}_{\text{IR mode}}$$

UV mode: large  $\beta$  shift.      IR mode: small  $\beta$  shift.

RHMC: RBC+UKQCD, DW Nf=2+1 simulation [hep-lat/0804.0473;PRD76(2007)]

Clark and Kennedy KS fermion [hep-lat/0610047;PRD75(2007)]

Takaishi and Nakamura, One-flavor Wilson fermion F.T. [LAT2007,hep-lat/0711.3888]

### 3. Algorithmic developments for dynamical QCD

(Wilson type)

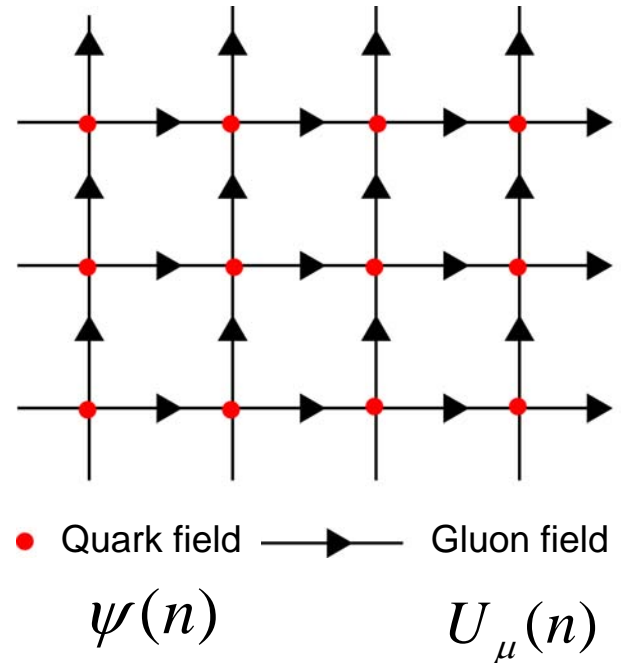
- Lattice QCD partition function

$$Z = \int \prod dU d\psi e^{-S[U, \psi]}$$

$S[U, \psi] = S_G[U] + S_Q[U, \psi]$ : Lattice QCD action

$S_G[U]$ : Gluon part ( $\rightarrow \text{Tr}[F_{\mu\nu} F_{\mu\nu}]/(4g^2)$ )

$S_Q[U, \psi]$ : Quark part ( $\rightarrow \sum_f \bar{\psi}_f (D + m_f) \psi_f$ )



- Nf=2+1 partition function  
( $\psi$  integ.out)

$$Z = \int \prod dU \det[D_{ud}]^2 \det[D_s] e^{-S[U]}$$

HMC algorithm to generate  $\{U\}$ .

## 2. Machine Trends (cont'd)

- 1~10 PFlops machine Bottlenecks
  - Memory band width
    - DDR3(1333) 10GB/sec
    - RambusXDR 26GB/sec
    - Byte/Flop < 0.25 (single CPU)
    - GPGPU is more better 100GB/sec

Multi slots/node enhances the node speed. [SMP or NUMA] but...

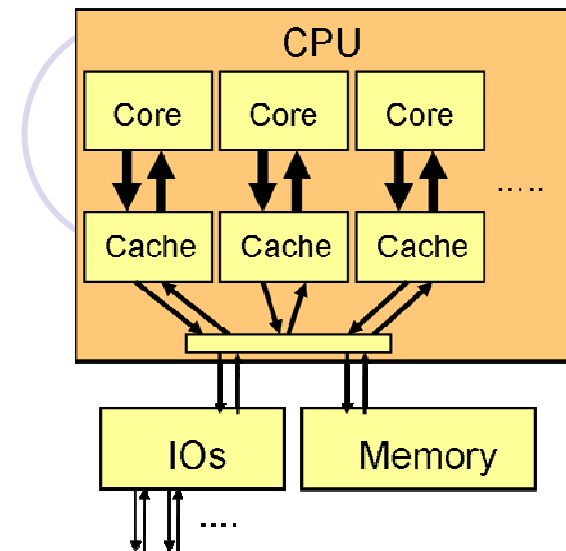
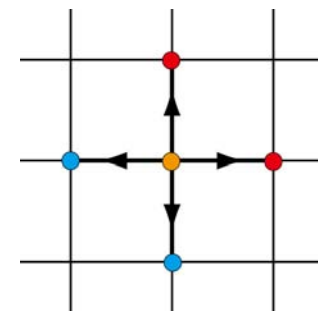
- IO/ Network band width

Depends on the NIC but

- Myrinet 10G 1.25GB/sec
- Infiniband DDR 2.0GB/sec
- Ex. Byte/Flop < 2/48 = 0.04
- To balance, multi rail (x4 or x8...)

$$M(n, m) = \sum_{\mu=1}^4 \left[ (1 - \gamma_{\mu}) U_{\mu}(n) \delta_{n+\hat{\mu}, m} + (1 + \gamma_{\mu}) U_{\mu}^{\dagger}(m) \delta_{n-\hat{\mu}, m} \right]$$

Hopping Mult :  
~3Byte/Flop req.



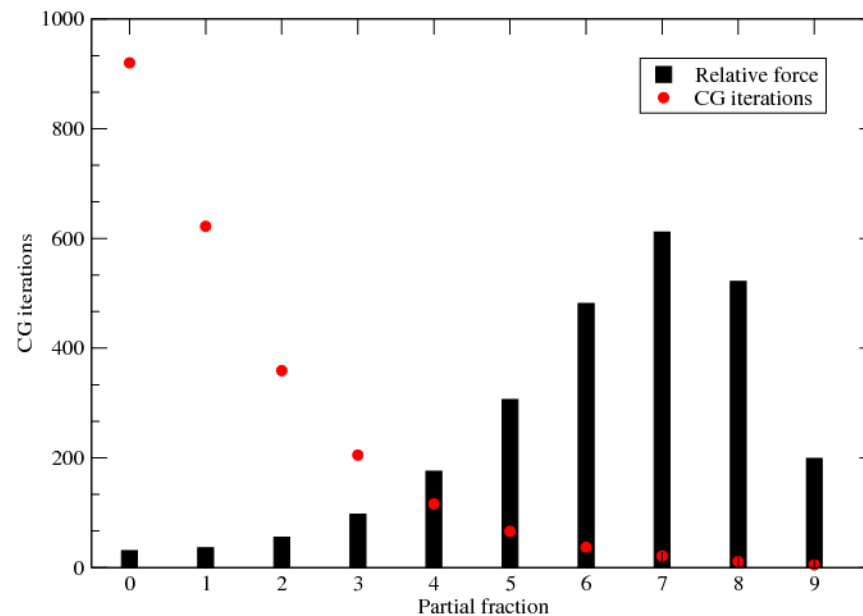
Blocking is required at each level (core/cpu/node) for 1PFlops machine<sub>53</sub>

### 3. Algorithmic developments...(cont'd)

#### (c) $n$ -th root trick and Rational approximation RHMC

Further cost reduction using Rational approximation

$$Action = \phi^\dagger M^{-1/n} \phi = \sum_{j=UV\text{pole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi + \sum_{j=IR\text{pole}} \phi^\dagger \frac{\alpha_j}{M + \beta_j} \phi$$



DW  $\beta = 2.13$ ,  
 $24^3 \times 64 \times 16$   
 $m_{ud}/m_s = 0.25$   
 RHMC force norm

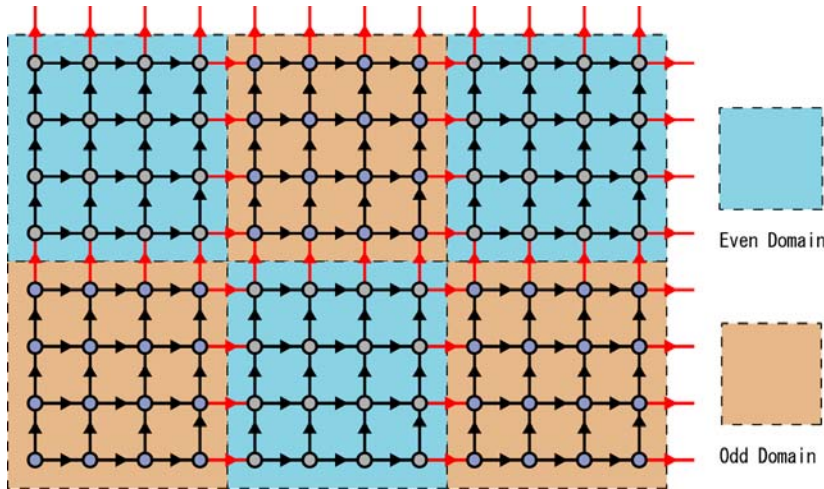
IR mode: small  $\beta$  shift  
 Expensive cost, small force  
 => Coarser MD step

UV mode: large  $\beta$  shift  
 Cheap cost, large force  
 => finer MD step

### 3. Algorithmic developments...(cont'd)

(1) Transform/split  $\det[D]$  using preconditioner (Action Prec.)

(b) Luscher Domain-Decomposition preconditioned DDHMC



[Lüscher, JHEP 0305 '03, CPC 165 '05]

$$\det[D] = \det \begin{pmatrix} D_{ee} & 0 \\ 0 & D_{oo} \end{pmatrix} \det \begin{pmatrix} 1 & D_{ee}^{-1} D_{eo} \\ D_{oo}^{-1} D_{oe} & 1 \end{pmatrix}$$

$$= \det[D_{ee}] \det[D_{oo}] \det[1 - D_{ee}^{-1} D_{eo} D_{oo}^{-1} D_{oe}]$$

$$= \det[D_{ee}] \det[D_{oo}] \det[\hat{D}_{ee}]$$

UV mode

IR mode

$\hat{D}_{ee}$ : Schur complement of D

DDHMC simulations:

- ALPHA: Von Hippel
- CERN: Luscher, Debbio, Giusti, Petronzio
- PACS-CS

How about another decomposition/blocking?

- ILU preconditioning
- Point / stripe blocking for MG solver, Overlap kernel

[M. Peardon, hep-lat/0011080]

[A. Boriçi, hep-lat/0704.2341; LAT2007]

### 3. Algorithmic developments...(cont'd)

## (2) MD integrator improvements

### ○ Optimize / Customize your MD integrator

Takaishi & de Forcrand, PRE73 (2006);  
Clark & Kennedy, LAT2007;  
Poster by Kennedy

- Shadow Hamiltonian contains errors expressed with Poisson brackets.
- Offline measurement of Poisson brackets;  
exp. val.  $\langle \{A, \{B, \{\dots\}\}\} \rangle$
- Minimize the errors by tuning integration parameter,  $\lambda$ , number of time scale, number of pseudo-fermions, ... etc.