

# Domain Wall Fermion Simulations with the Exact One-Flavor Algorithm

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The 34th International Symposium on Lattice Field Theory (Southampton, UK)

July 27th, 2016

## Motivation

- Recent advances in algorithms used by RBC/UKQCD have driven down the cost of simulating degenerate light quark pairs:
  - Extensive tuning of forces via **Hasenbusch mass splitting** [Phys. Lett. B519 177-182]
  - Shamir DWF  $\rightarrow$  Möbius DWF  $\rightarrow$  **zMöbius DWF** [Izubuchi et al., Lattice 2015]
  - Reduced  $L_s$  approximation** during molecular dynamics [proposed by Brower et al., arXiv:1206.5214; implemented by G. McGlynn, Lattice 2015]
  - Mixed precision CG**: single precision inner solves, double precision defect correction
- RHMC strange and charm quark determinants are now the most expensive part of our evolution strategy

Gauge	5800 s	11.6%
<b>Light quarks (<math>L_s = 14</math>)</b>	<b>18000 s</b>	<b>36.1%</b>
<b><math>L_s = 14/L_s = 32</math> correction det.</b>	<b>1600 s</b>	<b>3.3%</b>
<b>Strange and charm quarks (<math>L_s = 32</math>)</b>	<b>24200 s</b>	<b>48.5%</b>
DED	170 s	0.3%
Total	50000 s	—

**Table:** Timings for one HMC trajectory of  $80^2 \times 96 \times 192$   $N_f = 2 + 1 + 1$  physical mass  $a^{-1} \approx 3$  GeV ensemble on a 12,288-node BG/Q partition [G. McGlynn, Ph.D. thesis]

## Motivation (cont'd.)

- These techniques are of limited use for RHMC:
  - ▶ Unclear how to restart inner single-precision solver in the context of multishift CG
  - ▶ Cost of multishift  $D^\dagger D$  inversions at light quark masses largely negates potential gain from Hasenbusch splitting
- For  $I = 0$   $K \rightarrow \pi\pi$  calculations with G-parity boundary conditions  $D^\dagger D$  describes 4 flavors, and RHMC is needed for light quarks as well [C. Kelly, Thur. @ 15:50]
- **Goal:** Explore the exact one-flavor algorithm as an alternative to RHMC for simulating single quark flavors or degenerate G-parity quark pairs

## The Exact One-Flavor Algorithm

- Introduced by TWQCD for efficient one-flavor simulations on GPU clusters
- History:
  - ▶ 2009: Introduction [TWQCD, arXiv:0911.5532]
  - ▶ 2014: Detailed derivation [Chen and Chiu, Phys. Lett. B738 55-60]
  - ▶ 2014: Demonstration of  $\sim 20\%$  overall speed-up in  $16^3 \times 32 \times 16$   $N_f = 2 + 1$  simulation with EOFA vs. RHMC for heavy quark [Chen and Chiu, arXiv:1412.0819]
- **Main idea:** Use block manipulations in spin space to write

$$\det \left[ \frac{D(m_1)}{D(m_2)} \right] = \frac{1}{\det(\mathcal{M}_L)} \cdot \frac{1}{\det(\mathcal{M}_R)}$$

with  $\mathcal{M}_L$  and  $\mathcal{M}_R$  Hermitian and positive-definite

- Contrast with RHMC, where we instead compute

$$\det \left[ \frac{D(m_1)}{D(m_2)} \right] = \left\{ \det \left[ \frac{D^\dagger D(m_1)}{D^\dagger D(m_2)} \right] \right\}^{1/2}$$

using a rational approximation to the square root

- Exact in the sense that one does not need to take a fractional power of the fermion determinant to remove unwanted flavors

## Derivation Sketch I [Chen and Chiu, Phys. Lett. B738 55-60]

- We begin by factoring the DWF Dirac operator:

- ▶  $D_w$ : Wilson Dirac operator
- ▶  $c, d$ : Möbius parameters
- ▶  $L_{ss'}$ : 5D hopping term

$$(D_{\text{DWF}})_{xx',ss'} = \left( (c + d) D_w + \mathbb{1} \right)_{xx'} \delta_{ss'} + \left( (c - d) D_w - \mathbb{1} \right)_{xx'} L_{ss'}$$

$$= \underbrace{\left\{ (D_w)_{xx'} \delta_{ss'} + \delta_{xx'} \left( d + c(1 + L)(1 - L)^{-1} \right)_{ss'} \right\}}_{D_{\text{EOFA}}} \times \left\{ d(1 - L) + c(1 + L) \right\}$$

$$D_{\text{EOFA}} \equiv (D_w)_{xx'} \delta_{ss'} + \delta_{xx'} (P_+ M_+ + P_- M_-)_{ss'}$$

- $M_{\pm}$  does not involve the gauge field and can be worked out explicitly
- Shamir kernel:
  - ▶  $(c, d) = (1/2, 1/2)$
  - ▶  $D_{\text{DWF}}$  and  $D_{\text{EOFA}}$  are the same operator
- Möbius kernel:
  - ▶  $(c, d) = (\alpha/2, 1/2)$
  - ▶  $D_{\text{EOFA}}^{\perp}$  is dense but has a somewhat better condition number than  $D_{\text{DWF}}^{\perp}$
- $H \equiv \gamma_5 R_5 D_{\text{EOFA}}$  is Hermitian, but not positive-definite

## Derivation Sketch II [Chen and Chiu, Phys. Lett. B738 55-60]

- Consider a slight generalization of  $D_{\text{EOFA}}$ , in the chiral representation of  $\gamma^\mu$ :

$$\tilde{D}(m_1, m_2) = \begin{pmatrix} W - M_5 + M_+(m_1) & (\sigma \cdot t) \\ -(\sigma \cdot t)^\dagger & W - M_5 + M_-(m_2) \end{pmatrix}$$

- Applying the Schur det. identity to  $D_{\text{EOFA}}(m) = \tilde{D}(m, m)$ , and taking a ratio:

$$\frac{\det(D_{\text{EOFA}}(m_1))}{\det(D_{\text{EOFA}}(m_2))} = \frac{\det(W - M_5 + M_+(m_1)) \cdot \det(H_-(m_1))}{\det(W - M_5 + M_-(m_2)) \cdot \det(H_+(m_2))} \begin{matrix} \swarrow \\ \searrow \end{matrix} \text{Schur complements}$$

- Defining  $\Delta_\pm \equiv R_5 (M_\pm(m_2) - M_\pm(m_1)) = k\Omega_\pm \Omega_\pm^\dagger$  ( $\propto m_2 - m_1$ ), also have:

$$\frac{\det(\tilde{D}(m_1, m_2))}{\det(\tilde{D}(m_1, m_2))} = 1 \implies \frac{\det(W - M_5 + M_+(m_1))}{\det(W - M_5 + M_-(m_2))} = \frac{\det(H_+(m_2) - \Delta_+)}{\det(H_-(m_1) + \Delta_-)}$$

- Finally, using Sylvester's determinant identity ( $\det(\mathbb{1} + AB) = \det(\mathbb{1} + BA)$ ):

$$\frac{\det(D_{\text{EOFA}}(m_1))}{\det(D_{\text{EOFA}}(m_2))} = \left[ \det \left( \underbrace{\mathbb{1} + k\Omega_-^\dagger \frac{1}{H_-(m_1)} \Omega_-}_{\equiv \mathcal{M}_L} \right) \right]^{-1} \cdot \left[ \det \left( \underbrace{\mathbb{1} + k\Omega_+^\dagger \frac{1}{H_+(m_2) - \Delta_+ P_+}_{\equiv \mathcal{M}_R} \Omega_+}_{\text{Hermitian and pos.-def.}!} \right) \right]^{-1}$$

## Derivation Sketch III [Chen and Chiu, Phys. Lett. B738 55-60]

- To simulate, we express the determinant as a path integral:

$$\frac{1}{\det(\mathcal{M}_L)} \cdot \frac{1}{\det(\mathcal{M}_R)} = \int \mathcal{D}\phi_L \mathcal{D}\phi_L^\dagger \mathcal{D}\phi_R \mathcal{D}\phi_R^\dagger e^{-\phi_L^\dagger \mathcal{M}_L \phi_L - \phi_R^\dagger \mathcal{M}_R \phi_R}$$

- $\phi_L$  and  $\phi_R$  are bosonic pseudofermion fields with two spin components
- $\mathcal{M}_L$  and  $\mathcal{M}_R$  contain nested matrix inverses  $\rightarrow$  expensive to compute with CG
- Easier to work with block form:

$$\mathcal{M}_{\text{EOFA}} = \mathbb{1} - kP_- \Omega_-^\dagger \frac{1}{H(m_1)} \Omega_- P_- + kP_+ \Omega_+^\dagger \frac{1}{H(m_2) - \Delta_+ P_+} \Omega_+ P_+$$

for which we have, in terms of an ordinary four-component spinor:

$$\frac{\det(D_{\text{EOFA}}(m_1))}{\det(D_{\text{EOFA}}(m_2))} = \int \mathcal{D}\phi \mathcal{D}\phi^\dagger e^{-\phi^\dagger \mathcal{M}_{\text{EOFA}} \phi}$$

- EOFA evolution requires inversions of the general form  $(H(m) + \alpha \Delta_\pm P_\pm) \psi = \phi$

# The Hybrid Monte Carlo Algorithm

- We perform dynamical QCD simulations using the HMC algorithm
- **Idea:** Generate a Markov chain of gauge field configurations by evolving a Hamiltonian system in (unphysical) molecular dynamics “time”
  - ▶ Generalized coordinate: Gauge field ( $U_{x,\mu}$ )
  - ▶ Conjugate momentum:  $\pi_{x,\mu} \in \mathfrak{su}(3)$
  - ▶ Hamiltonian:  $H = \frac{1}{2}\pi^2 + S_g[U] + S_f[U]$
  - ▶ Equations of motion:

$$\begin{cases} \partial_\tau U_{x,\mu} = \pi_{x,\mu} U_{x,\mu} \\ \partial_\tau \pi_{x,\mu} = -T^a \partial_{x,\mu}^a (S_g[U] + S_f[U]) \end{cases}$$

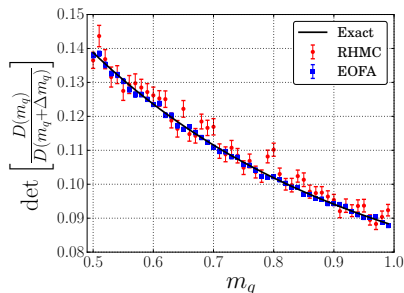
- Metropolis accept/reject step corrects for finite precision integration
  - ▶ Accept new gauge field  $U'_{x,\mu}$  with probability  $P_{\text{accept}} = \min(1, e^{-\Delta H})$
- Implementing this for EOFA requires:
  - 1 Action  $S_f[U]$
  - 2 Pseudofermion heatbath
  - 3 Pseudofermion contribution to momentum update  $\pi_{x,\mu} \leftarrow \pi_{x,\mu} - T^a (\partial_{x,\mu}^a S_f[U]) \Delta\tau$
- Tests performed on two  $N_f = 2 + 1$  Shamir DWF ensembles:
  - ▶ 16l:  $16^3 \times 32 \times 16$ ,  $\beta = 2.13$ ,  $(am_l, am_h) = (0.01, 0.032)$  [Phys. Rev. D**76**, 014504]
  - ▶ 32l:  $32^3 \times 64 \times 16$ ,  $\beta = 2.25$ ,  $(am_l, am_h) = (0.004, 0.03)$  [Phys. Rev. D**93**, 054502]



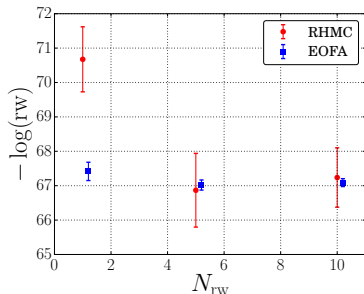
# I. Action: Equivalence of EOFA and RHMC for Möbius DWF

- Relation between RHMC determinant ratios and EOFA determinant ratios:

$$\left\{ \det \left[ \frac{D^\dagger D_{\text{DWF}}(m_1)}{D^\dagger D_{\text{DWF}}(m_2)} \right] \right\}^{1/2} = \left( \frac{(c+d)^{L_s} + m_1 (c-d)^{L_s}}{(c+d)^{L_s} + m_2 (c-d)^{L_s}} \right)^{12L^3 T} \det \left[ \frac{D_{\text{EOFA}}(m_1)}{D_{\text{EOFA}}(m_2)} \right]$$



(a) Free  $4^5$  lattice,  $\Delta m_q = 0.01$ ,  $\alpha = 4.0$  (Möbius scale), 20 stochastic hits.



(b) 16l. Reweight  $am_h = 0.032 \rightarrow 0.042$  in  $N_{rw}$  steps with 10 hits per step.

- Observe significantly smaller systematic and statistical errors for EOFA**
  - Cheaper to perform quark mass reweighting with EOFA!

## II. Heatbath

- At start of HMC trajectory: draw  $\eta$  with  $P(\eta) \propto e^{-\eta^2/2}$ , compute  $\phi = \mathcal{M}_{\text{EOFA}}^{-1/2} \eta$
- Still requires rational approximation  $x^{-1/2} \simeq \alpha_0 + \sum_{l=1}^{N_p} \alpha_l / (\beta_l + x)$
- Defining  $\gamma_l = (1 + \beta_l)^{-1}$ , can show

$$\mathcal{M}_{\text{EOFA}}^{-1/2} \simeq \alpha_0 \mathbb{1} + \sum_{l=1}^{N_p} \alpha_l \gamma_l \left[ \mathbb{1} + k\gamma_l P_- \Omega_-^\dagger \frac{1}{H(m_1) - \gamma_l \Delta_- P_-} \Omega_- P_- - k\gamma_l P_+ \Omega_+^\dagger \frac{1}{H(m_2) - \gamma_l \beta_l \Delta_+ P_+} \Omega_+ P_+ \right]$$

- $\Delta_\pm P_\pm$  has large number of zero modes  $\rightarrow$  not invertible! (no multishift)

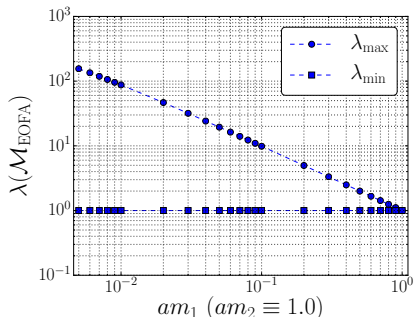


Figure: Spectral range of  $\mathcal{M}_{\text{EOFA}}$ .

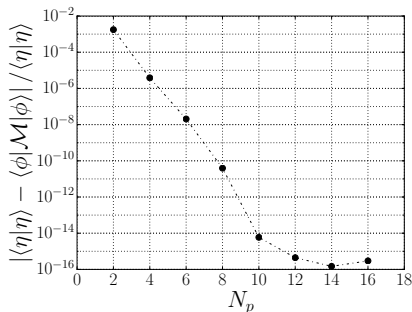


Figure: Heatbath relative error using  $N_p$  poles.

### III. Momentum Update

- EOFA pseudofermion force is

$$\begin{cases} \partial_{x,\mu}^a S_f[U] = k\chi_L^\dagger \gamma_5 R_5 (\partial_{x,\mu}^a D_w) \chi_L - k\chi_R^\dagger \gamma_5 R_5 (\partial_{x,\mu}^a D_w) \chi_R \\ \chi_L = [H(m_1)]^{-1} \Omega_- P_- \phi, \quad \chi_R = [H(m_2) - \Delta_+ P_+]^{-1} \Omega_+ P_+ \phi \end{cases}$$

- Compared to RHMC:
  - Cheaper to evaluate
  - Somewhat smaller total force, with  $\langle F \rangle_L \ll \langle F \rangle_R$

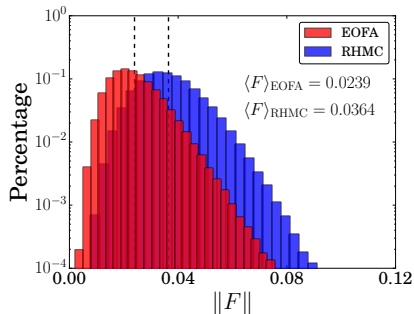


Figure: Lattice-wide distribution of EOFA and RHMC total forces by link

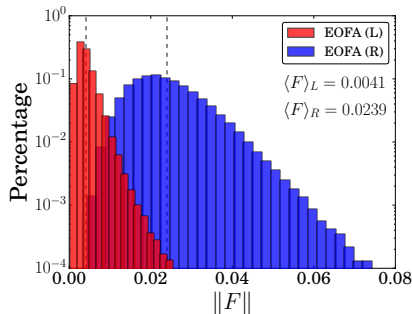
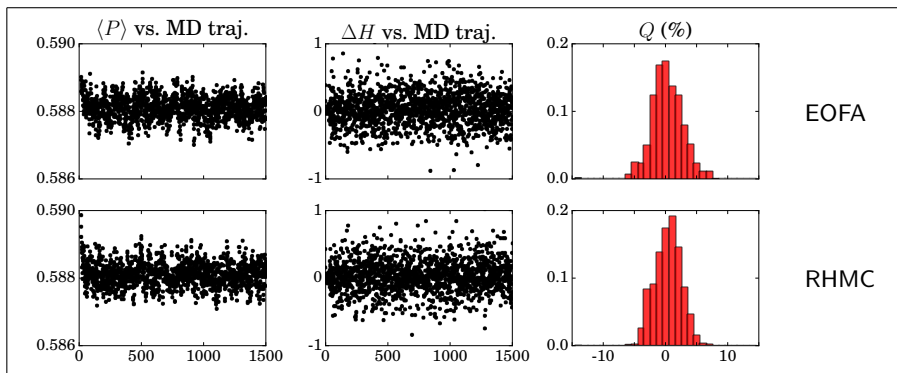


Figure: Lattice-wide distribution of EOFA force contributions from L and R terms by link

# Test: Reproduce 16l Ensemble [Phys. Rev. D76, 014504]

- Parallel  $N_f = 2 + 1$  evolutions: compare RHMC heavy quark to EOFA heavy quark



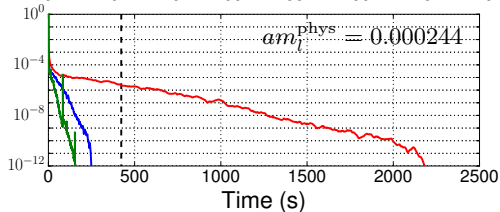
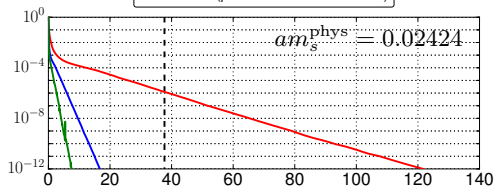
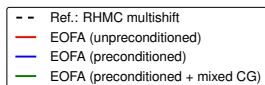
$\beta$	2.13
$am_l$	0.01
$am_h$	0.032

Table: Parameters

	EOFA	RHMC		EOFA	RHMC
$am_\pi$	0.243(2)	0.244(1)	$af_\pi$	0.0887(8)	0.0883(6)
$am_K$	0.326(2)	0.326(1)	$af_K$	0.0966(6)	0.0963(4)
$am_\Omega$	0.990(9)	0.995(10)	$am'_{\text{res}}(m_l)$	0.00305(4)	0.00306(4)

Table: Spectrum

# Optimizations I: Accelerating EOFA Inversions



- EOFA solves accelerated with:
  - ▶ Even-odd preconditioning
  - ▶ Optimized BG/Q assembly generated by BAGEL [P. Boyle]
  - ▶ Mixed-precision CG
- Test on 32l ensemble at physical  $am_l$  and  $am_s$  determined by chiral fits [Phys. Rev. D**93**, 054502]
- Reference (dashed line): even-odd preconditioned multishift solve of  $D^\dagger D$  with same quark mass

	$am_s^{\text{phys}}$	$am_l^{\text{phys}}$
EOFA	7.6 s	156.5 s
RHMC	37.7 s	422.5 s
Ratio	5.0	2.7

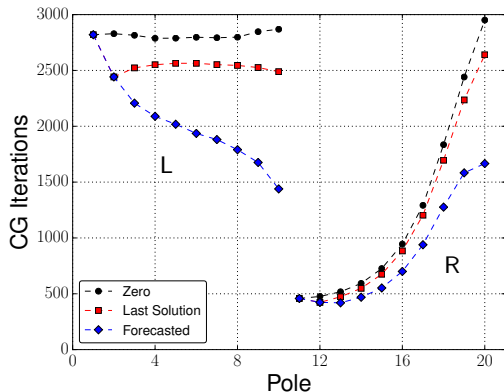
**Table:** Comparison of total CG inversion time between optimized EOFA and RHMC

## Optimizations II: Accelerating EOFA Heatbath

- Following TWQCD, we use the chronological inversion method introduced by Brower et al. to forecast CG guesses [Nucl. Phys. B**484**, 353-374]
- Forecast solution to  $(H + \alpha_l \Delta_{\pm} P_{\pm}) \psi = \phi$  by minimizing

$$\Psi[x] = x^{\dagger} (H + \alpha_l \Delta_{\pm} P_{\pm}) x - \phi^{\dagger} x - x^{\dagger} \phi$$

over the space of accumulated solutions for previous shifts  $\alpha_l$



- Test: 16l, 10 poles in rational approximation
- Find  $\sim 30\%$  reduction in total iteration count
- No additional gain from sharing solutions between L and R terms

## Conclusions and Next Steps

- We have:
  - ▶ Independently implemented TWQCD's EOFA, and performed basic algorithmic tests
  - ▶ Reproduced 16l ensemble using EOFA to evolve the heavy flavor
  - ▶ Partially implemented and tested a number of optimizations:
    - 1 Even-odd preconditioning
    - 2 Optimized BG/Q assembly for sparse matrix applications (BAGEL)
    - 3 Mixed-precision CG
    - 4 Forecasted CG guesses for heatbath
    - 5 Hasenbusch mass splitting
- Next steps:
  - ▶ Better ideas to ameliorate the cost of the EOFA heatbath?
  - ▶ Tuning Sexton-Weingarten integration and/or Hasenbusch mass splitting?
  - ▶ G-parity simulations with EOFA light quarks
  - ▶ Port to P. Boyle's Grid library: is a further speed-up possible if we perform deflated sparse matrix inversions with HDCR? [Poster by A. Yamaguchi and P. Boyle]
- We expect a gain over RHMC with a fully optimized and tuned implementation of EOFA, but the exact gain is difficult to predict!

**Thank you!**

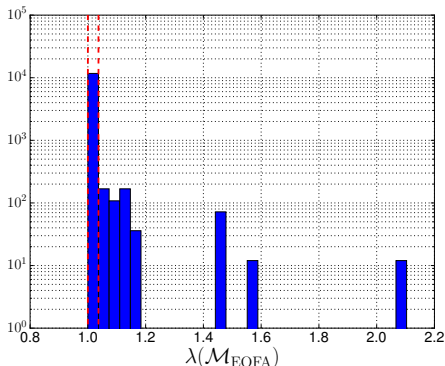
## Extra Slides



## Spectrum of the EOFA and RHMC actions

- Can think of EOFA as a preconditioning step applied to RHMC action
  - ▶ Mapping of eigenvalue spectrum:  $(\lambda_{\min}, \lambda_{\max})_{\text{RHMC}} \mapsto (1, \lambda_{\max})_{\text{EOFA}}$
  - ▶ Similar range, but  $\mathcal{M}_{\text{EOFA}}$  spectrum more densely concentrated near low end
  - ▶ Computes same determinant ratio, but easier to stochastically estimate  $\mathcal{M}_{\text{EOFA}}$ !
  - ▶ Notation: action is  $S = \phi^\dagger \mathcal{M} \phi$

$$\mathcal{M}_{\text{EOFA}} = 1 - kP_- \Omega_-^\dagger \frac{1}{H(m_1)} \Omega_- P_- + kP_+ \Omega_+^\dagger \frac{1}{H(m_2) - \Delta_+ P_+} \Omega_+ P_+$$



$$\mathcal{M}_{\text{RHMC}} = (D^\dagger D(m_2))^{1/4} (D^\dagger D(m_1))^{-1/2} (D^\dagger D(m_2))^{1/4}$$

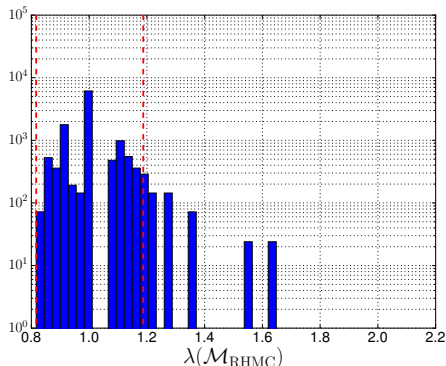


Figure:  $4^5$  free lattice,  $am_1 = 0.1$ ,  $am_2 = 1.0$ ,  $aM_5 = 1.8$ . Lines mark 95% of density.