

# Implementing a Self-Corrected Chemical Potential Scheme in Determinant Quantum Monte Carlo Simulations

Kevin Kleiner

Faculty Research Advisor: Dr. Steve Johnston

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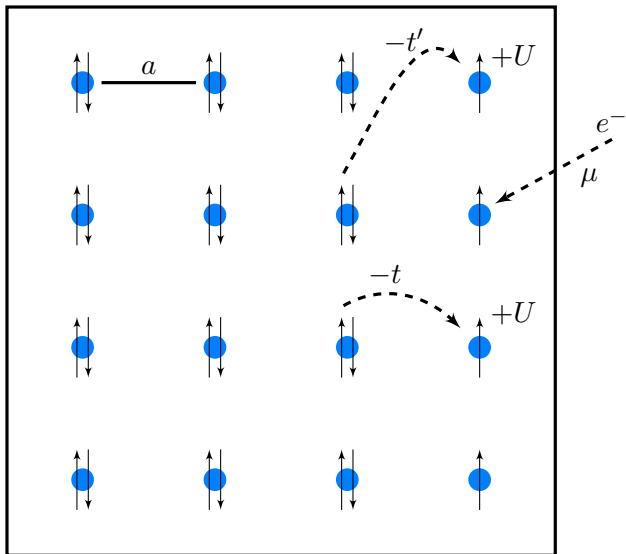
# Many-Body Problem in Solid-State Physics

- Quantum Mechanics - spatial/spin/energy states based on system Hamiltonian

$$\hat{H} = - \sum_i \frac{\hbar^2}{2m_e} \nabla_i^2 - \sum_I \frac{\hbar^2}{2m_I} \nabla_I^2 + \frac{1}{2} \sum_I \sum_{J \neq I} \frac{ke^2 Z_I Z_J}{|\mathbf{R}_I - \mathbf{R}_J|} - \sum_i \sum_I \frac{ke^2 Z_I}{|\mathbf{r}_i - \mathbf{R}_I|} + \frac{1}{2} \sum_i \sum_{j \neq i} \frac{ke^2}{|\mathbf{r}_i - \mathbf{r}_j|}$$

- Determinant Quantum Monte Carlo (DQMC) simulations - approximate the partition function  $Z(\hat{H})$  using auxiliary field sampling (system configurations)
- Favors more significant contributions to  $Z$  through acceptance/rejection scheme  
(S. Johnston et al., *Phys. Rev. B* **87**, 235133 (2013))
- Compute expectation values for macroscopic properties - energy, magnetization, electron filling, etc.

# 2D Repulsive Hubbard Model

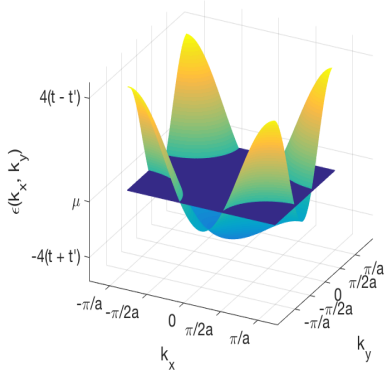


$$\begin{aligned}\hat{H} &= \hat{H}_t + \hat{H}_U + \hat{H}_\mu \\ &= -t \sum_{\langle i,j \rangle, \sigma} (\hat{c}_{i,\sigma}^\dagger \hat{c}_{j,\sigma} + \hat{c}_{j,\sigma}^\dagger \hat{c}_{i,\sigma}) + U \sum_{i=1}^N \hat{n}_{i\uparrow} \hat{n}_{i\downarrow} - \mu \sum_{i,\sigma} \hat{n}_{i,\sigma}\end{aligned}$$

- Electrons can diffuse to and from surroundings to reach equilibrium
- Competition of allowed electron behaviors captured here
- Green's functions as field propagators  
(M. Jarrell, *Z. F. Physik B - Condensed Matter* **90**, 2 (1993))

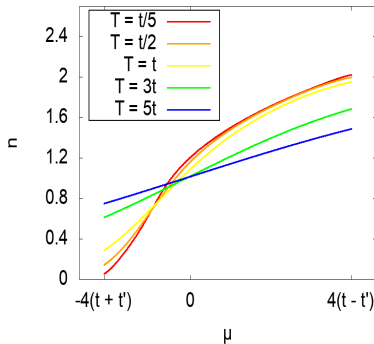
# Non-Interacting Case: Band and Occupation Results

## Tight-Binding Band Structure

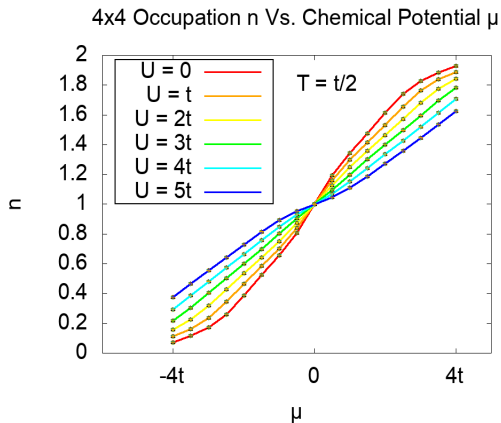


$$\epsilon = -2t[\cos(k_x a) + \cos(k_y a)] - 4t' \cos(k_x a) \cos(k_y a)$$

## Occupation n Vs. Chemical Potential $\mu$

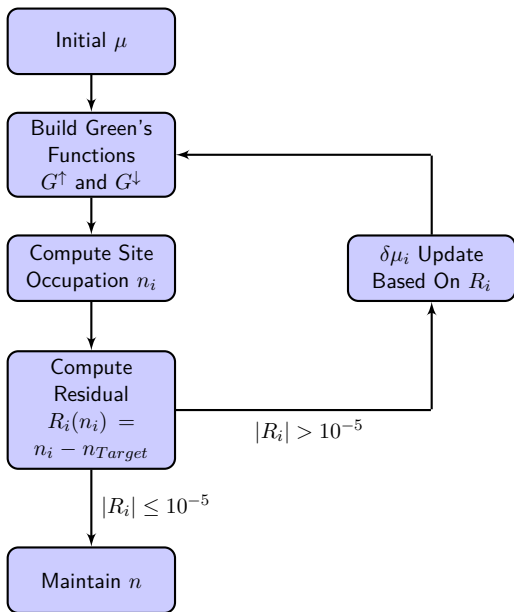


$$n = \frac{2}{N} \sum_{k_x} \sum_{k_y} \frac{1}{e^{\beta(\epsilon(k_x, k_y) - \mu)} + 1}$$



- Small error bars - 20,000 warmup/measurement sweeps
- Flattening near half-filling - Mott Gap formation  
(F. Ohkawa, arXiv:cond-mat/0606644 (2007))
- Maintain desired filling - accurate initial input for  $\mu$  (overhead runs)

# Occupation-Based Feedback Loop During Warmups



# Chemical Potential Response

$$n = \frac{1}{N} \sum_i^N [(1 - G_{ii}^\uparrow) + (1 - G_{ii}^\downarrow)]$$

( $i$  refers to site spatial index)

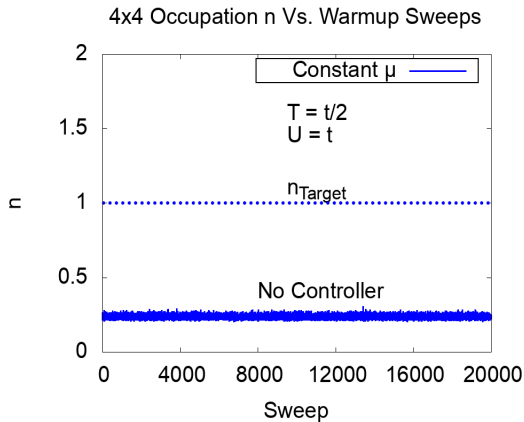
- Occupation  $n$  starts with a nonzero residual from the target:  
 $R_i = n_i - n_{Target}$  ( $i$  refers to simulation sweep index)
- Correction feedback to the chemical potential  $\mu$  as a response  
(Z. Zhao et al., *IEEE Transactions on Systems, Man, and Cybernetics* **23**, 5 (1993))
- Implement and test a proportional-integral-derivative (PID) controller for  $\mu$

$$\begin{aligned} \delta\mu_i &= \delta\mu_{P,i} + \delta\mu_{I,i} + \delta\mu_{D,i} \\ &= -K_P R_i - K_I \left( \int_0^t R(t') dt' \right)_i - K_D \left( \frac{dR}{dt} \right)_i \end{aligned}$$

- Tune the influence of each term - gain coefficients  $K_P$ ,  $K_I$ , and  $K_D$



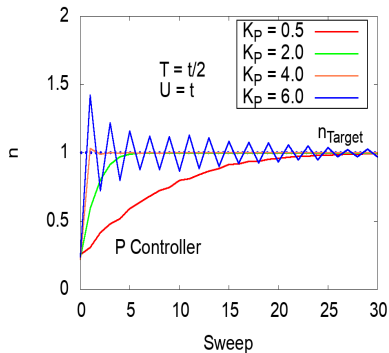
# Occupation During Warmups



$$\mu_0 = -3t$$

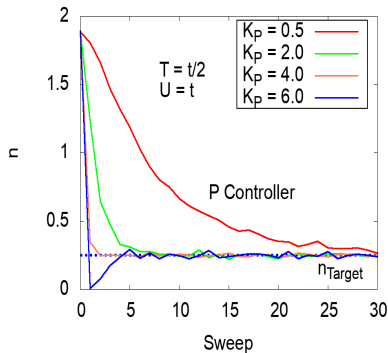
# P-Controller Convergence

4x4 Occupation n Vs. Warmup Sweeps



$$\mu_0 = -3t$$
$$n_{Target} = 1$$

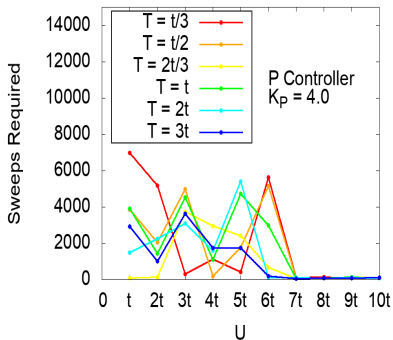
4x4 Occupation n Vs. Warmup Sweeps



$$\mu_0 = 4t$$
$$n_{Target} = 0.25$$

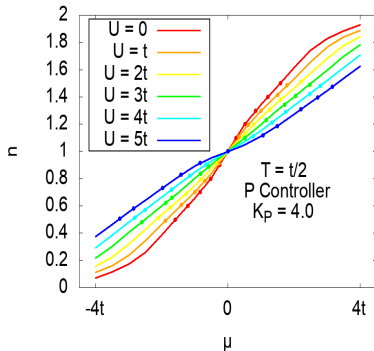
# P-Controller Robustness and Accuracy

4x4 n Convergence Vs. Interaction U



Warmup sweeps until  
 $R < 10^{-5}$

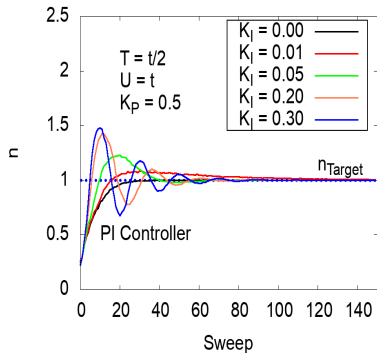
4x4 Occupation n Vs. Chemical Potential  $\mu$



$(\mu, n)$  after measurements  
 $\mu_0 = -3t$

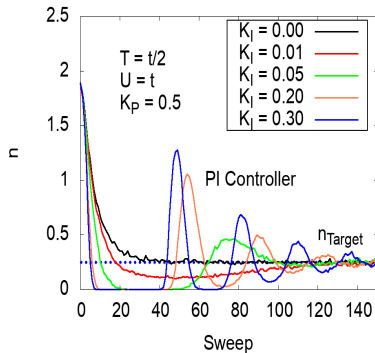
# PI-Controller Convergence

4x4 Occupation n Vs. Warmup Sweeps



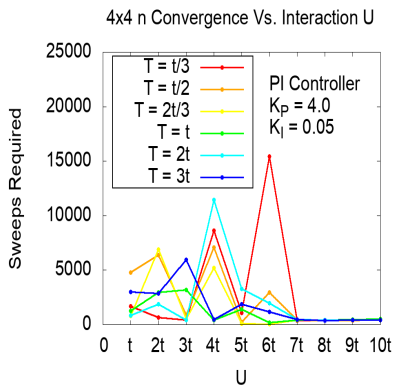
$$\mu_0 = -3t$$
$$n_{Target} = 1$$

4x4 Occupation n Vs. Warmup Sweeps

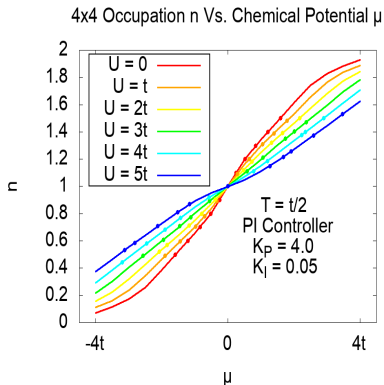


$$\mu_0 = 4t$$
$$n_{Target} = 0.25$$

# PI-Controller Robustness and Accuracy



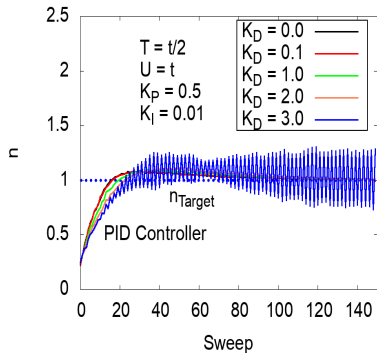
Warmup sweeps until  
 $R < 10^{-5}$



$(\mu, n)$  after measurements  
 $\mu_0 = -3t$

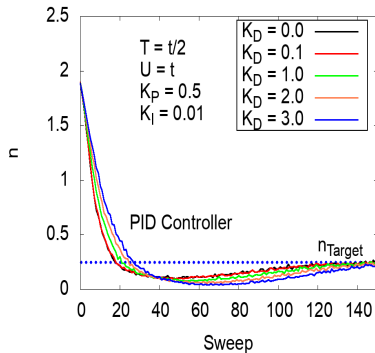
# PID-Controller Convergence

4x4 Occupation n Vs. Warmup Sweeps



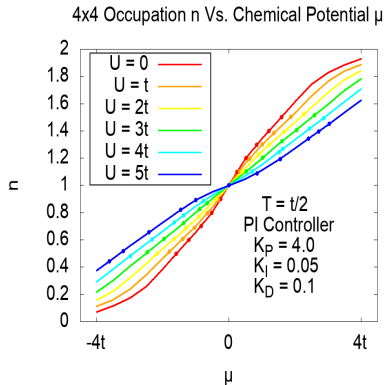
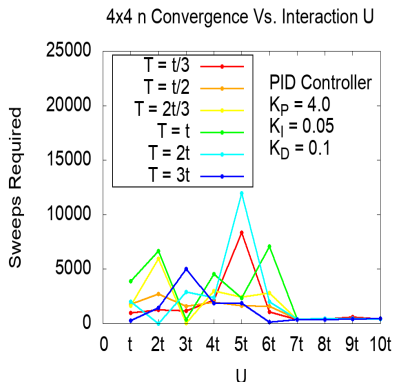
$$\mu_0 = -3t$$
$$n_{Target} = 1$$

4x4 Occupation n Vs. Warmup Sweeps



$$\mu_0 = 4t$$
$$n_{Target} = 0.25$$

# PID-Controller Robustness and Accuracy



Warmup sweeps until  
 $R < 10^{-5}$

$(\mu, n)$  after measurements  
 $\mu_0 = -3t$

- P controller seems the most reliable, but optimize  $K_P$  and  $R_{Tol}$  for  $U \geq 3t$

- More realistic models - atoms spatially displace from equilibrium as optical phonons

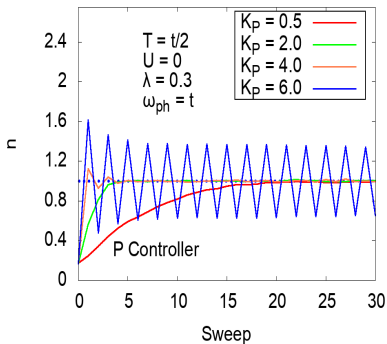
$$\begin{aligned}
 \hat{H} &= \hat{H}_t + \hat{H}_U + \hat{H}_\mu + \hat{H}_{Ion} + \hat{H}_{e-ph} \\
 &= -t \sum_{\langle i,j \rangle, \sigma} (\hat{c}_{i,\sigma}^\dagger \hat{c}_{j,\sigma} + \hat{c}_{j,\sigma}^\dagger \hat{c}_{i,\sigma}) + U \sum_{i=1}^N \hat{n}_{i\uparrow} \hat{n}_{i\downarrow} - \mu \sum_{i,\sigma} \hat{n}_{i,\sigma} + \\
 &\quad \sum_I \left( \frac{m_I \omega_{ph}^2}{2} \hat{X}_i^2 - \frac{\hbar^2}{2m_I} \nabla_I^2 \right) - g \sum_{i,\sigma} \hat{n}_{i,\sigma} \hat{X}_i
 \end{aligned}$$

- Electron occupations, ion displacements, and ion velocities as additional degrees of freedom
- Dimensionless electron-phonon coupling strength  $\lambda = g^2 / W \omega_{ph}^2$  (S. Johnston et al., *Phys. Rev. B* **87**, 235133 (2013))



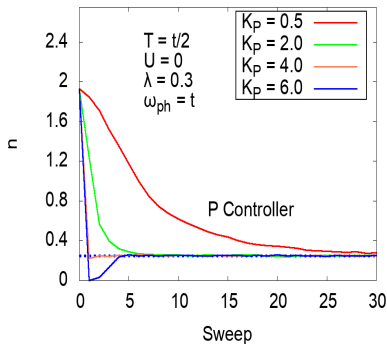
# P-Controller Convergence for Holstein

4x4 Occupation n Vs. Warmup Sweeps



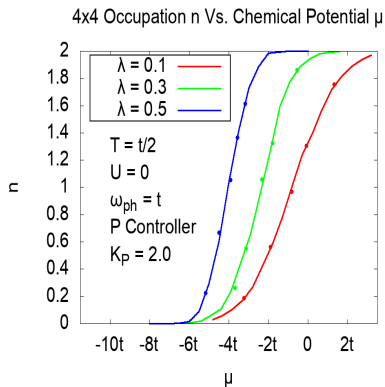
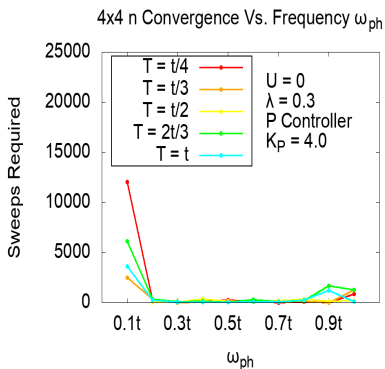
$$\mu_0 = -3t$$
$$n_{Target} = 1$$

4x4 Occupation n Vs. Warmup Sweeps



$$\mu_0 = 4t$$
$$n_{Target} = 0.25$$

# P-Controller Robustness and Accuracy for Holstein

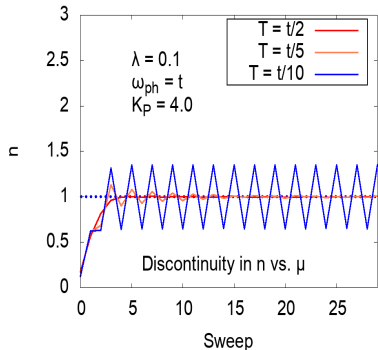


Warmup sweeps until  
 $R < 10^{-5}$

$(\mu, n)$  after measurements  
 $\mu_0 = -3t$  (imaginary time  $\delta\tau = 0.2$ )

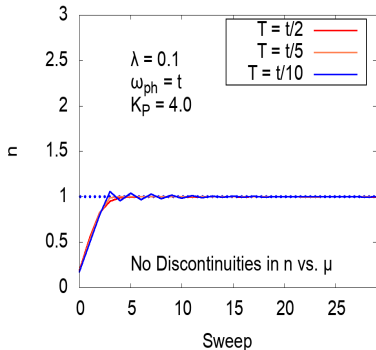
# Low Temperature Complications for Holstein

4x4 Occupation  $n$  Vs. Warmup Sweeps



Overshoots at  
low  $T$

10x10 Occupation  $n$  Vs. Warmup Sweeps

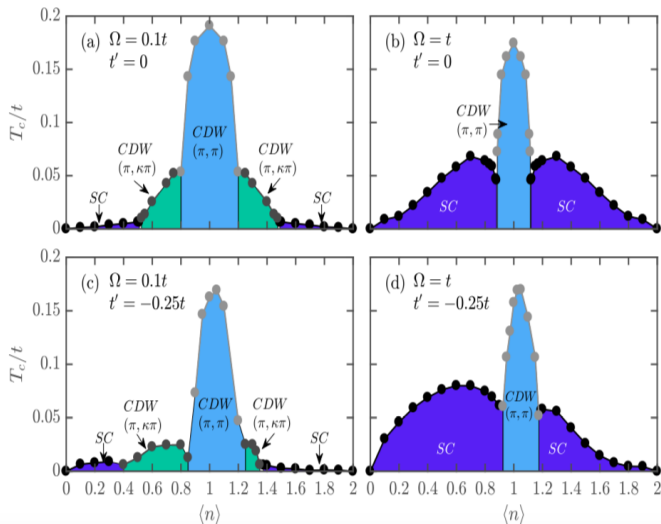


Converges at  
low  $T$

# Conclusions and Future Directions

- DQMC warmups/measurements: system partition function  $Z$
- Fixing  $\mu$  also fixes electron filling  $n$
- Hubbard/Holstein P-controller each sweep for convergence/reliability
- $\delta\mu = -K_P(n - n_{Target})$
- Optimize  $K_P$  for each phase-space regime especially:
  - Large Hubbard  $U$
  - Large Holstein  $\lambda$
  - Low  $T$  (also increase lattice size)
- Future steps: prevent occupation drifting with a stricter deactivation condition for  $\delta\mu$
- Competing interactions and ordered phases for Hubbard-Holstein

# Maintaining $n$ For $T < t/10$ : Phase Diagrams



(P. Dee et al., arXiv:1811.03676 (2018))

- [1] F. Ohkawa, arXiv:cond-mat/0606644 (2007).
- [2] M. Jarrell, *Z. F. Physik B - Condensed Matter* **90**, 2 (1993).
- [3] P. Dee, K. Nakatsukasa, Y. Wang, and S. Johnston, arXiv:1811.03676 (2018).
- [4] S. Johnston, E. Nowadnick, F. Kung, B. Moritz, R. Scalettar, and T. Devereaux, *Phys. Rev. B* **87**, 235133 (2013).
- [5] Z. Zhao, M. Tomizuka, and S. Isaka, *IEEE Transactions on Systems, Man, and Cybernetics* **23**, 5 (1993).