## Continuous-Time Quantum Monte Carlo Algorithms



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## Overview

Quick introduction to the Dynamical Mean Field Theory (DMFT)


Continuous-Time Auxiliary Field impurity solver algorithm and large clusters

Some (very few) results (see P.Werner's talk for more applications)


## DMFT and Impurity Problem

$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow} .
$$



Impurity Problem: $S_{\text {eff }}=-\sum_{\sigma} \iint_{0}^{\beta} d \tau d \tau^{\prime} c_{\sigma}^{\dagger}(\tau) \mathcal{G}_{0 \sigma}^{-1}\left(\tau-\tau^{\prime}\right) c_{\sigma}(\tau)+U \int_{0}^{\beta} d \tau n_{\uparrow}(\tau) n_{\downarrow}(\tau)$ Self Consistency: $\quad G\left(i \omega_{n}\right)=\sum_{\vec{k} \in B Z} \frac{1}{i \omega_{n}+\mu-\epsilon(\vec{k})-\Sigma\left(i \omega_{n}\right)}$.

## DMFT and Impurity Problem

Limit of infinite coordination number:

Impurity coupled to a bath \& self consistency condition

Impurity Problem: $S_{\text {eff }}=-\sum_{\sigma} \iint_{0}^{\beta} d \tau d \tau^{\prime} c_{\sigma}^{\dagger}(\tau) \mathcal{G}_{0 \sigma}^{-1}\left(\tau-\tau^{\prime}\right) c_{\sigma}(\tau)+U \int_{0}^{\beta} d \tau n_{\uparrow}(\tau) n_{\downarrow}(\tau)$ Self Consistency: $\quad G\left(i \omega_{n}\right)=\sum_{\vec{k} \in B Z} \frac{1}{i \omega_{n}+\mu-\epsilon(\vec{k})-\Sigma\left(i \omega_{n}\right)}$.

## DMFT Self Consistency

Noninteracting Density of States: Theory, LDA, ...


## Cluster DMFT

Various variants developed by Lichtenstein et al., Jarrell et al., Kotliar et al.


Infinite coordination number: momentum independent self energy.

Dynamic Cluster Approximation (DCA): reintroduce momentum dependence to DMFT.

DCA self energy is chosen to be constant within patches of the Brillouin zone Cluster impurity $S_{\text {eff }}=-\iint_{0}^{\beta} d \tau \sum_{i j \sigma} c_{i \sigma}^{\dagger}(\tau) \mathcal{G}_{i j, \sigma}^{0}\left(\tau-\tau^{\prime}\right)^{-1} c_{j \sigma}\left(\tau^{\prime}\right)+\int_{0}^{\beta} d \tau \sum_{j=1}^{N_{c}} U n_{j \uparrow}(\tau) n_{j \downarrow}(\tau)$
problem

$$
\Sigma_{K}=\mathcal{G}_{K}^{0}\left(i \omega_{n}\right)^{-1}-G_{\operatorname{imp}}^{-1}
$$

Self consistency condition

$$
\begin{aligned}
\bar{G}\left(K, i \omega_{n}\right) & =\int_{\mathrm{BZ} \text { patch }} \frac{d k}{\overline{\omega_{n}+\mu-\epsilon(k)-\Sigma_{K}}} \\
\mathcal{G}_{K}^{0}\left(i \omega_{n}\right)^{-1} & =\Sigma_{K}+\bar{G}_{K}^{-1}\left(i \omega_{n}\right)
\end{aligned}
$$

## Hirsch Fye QMC Impurity Solver

$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow} \cdot \quad Z=\operatorname{Tr} e^{-\beta H}=\operatorname{Tr} \prod_{l=1}^{L} e^{-\Delta \tau\left(H_{0}+V\right)}
$$

$$
Z \simeq \prod_{l=1}^{L} e^{-\Delta \tau H_{0}} e^{-\Delta \tau V}
$$

Trotter breakup: discretization of the integral, introduces Trotter errors

Auxiliary field decomposition

$$
\begin{aligned}
\exp \left[-\Delta \tau\left(U n_{\uparrow} n_{\downarrow}-\frac{1}{2}\left(n_{\uparrow}+n_{\downarrow}\right)\right)\right] & =\frac{1}{2} \sum_{\sigma= \pm 1} \exp \left[\lambda \sigma\left(n_{\uparrow}-n_{\downarrow}\right)\right] \\
\cosh (\lambda) & =\exp (\Delta \tau U / 2)
\end{aligned}
$$



Sampling of partition function integral on discretized time slices

## Continuous-Time Algorithms

Partition function in the interaction representation:

$$
Z=\operatorname{Tr}\left[e^{-\beta H_{0}} T_{\tau} e^{-\int_{0}^{\beta} d \tau V(\tau)}\right]
$$

Expansion into perturbation series (powers of the interaction $V$ ):

$$
Z=\sum_{k=0}^{\infty} \int d \tau_{1} \cdots \int_{\tau_{k-1}}^{\beta} d \tau_{k} \operatorname{Tr}\left[e^{-\beta H_{0}} e^{\tau_{k} H_{0}}(-V) \cdots e^{-\left(\tau_{2}-\tau_{1}\right) H_{0}}(-V) e^{-\tau_{1} H_{0}}\right] .
$$

Graphical representation of terms of the integral at different orders:

## Continuous-Time Algorithms

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$$

Graphical representation of terms of the integral at

$$
W_{0}=\operatorname{Tr}\left[e^{-\beta H_{0}}\right] \quad \text { а) }\left.\right|_{0}
$$ different orders:

## Continuous-Time Algorithms

Partition function in the interaction representation:

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$$

Graphical representation of terms of the integral at different orders:

$$
W_{0}=\operatorname{Tr}\left[e^{-\beta H_{0}}\right]
$$

a) $\left.\right|_{0}$
$W_{1}\left(\tau_{1}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\tau_{1} H_{0}}\right]$
b) $\mid$


## Continuous-Time Algorithms

Partition function in the interaction representation:

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Z=\operatorname{Tr}\left[e^{-\beta H_{0}} T_{\tau} e^{-\int_{0}^{\beta} d \tau V(\tau)}\right]
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$$

Graphical representation of terms of the integral at different orders:

$$
W_{0}=\operatorname{Tr}\left[e^{-\beta H_{0}}\right]
$$

a) $\left.\right|_{0}$
$W_{1}\left(\tau_{1}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\tau_{1} H_{0}}\right]$
b) $\mid$
$W_{2}\left(\tau_{1}, \tau_{2}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\left(\tau_{1}-\tau_{2}\right) H_{0}} V e^{-\tau_{2} H_{0}}\right]$
c) $\left.\right|_{0} \bigcirc_{\tau_{1}}$


## Continuous-Time Algorithms

Partition function in the interaction representation:

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$$

Graphical representation of terms of the integral at different orders:

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W_{0}=\operatorname{Tr}\left[e^{-\beta H_{0}}\right]
$$

a) ${ }_{0}$

$$
W_{1}\left(\tau_{1}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\tau_{1} H_{0}}\right]
$$

b) $\mid$

$$
W_{2}\left(\tau_{1}, \tau_{2}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\left(\tau_{1}-\tau_{2}\right) H_{0}} V e^{-\tau_{2} H_{0}}\right]
$$

c)


$W_{3}\left(\tau_{1}, \tau_{2}, \tau_{3}\right)=\operatorname{Tr}\left[e^{-\left(\beta-\tau_{1}\right) H_{0}} V e^{-\left(\tau_{1}-\tau_{2}\right) H_{0}} V e^{-\left(\tau_{2}-\tau_{3}\right) H_{0}} V e^{-\tau_{3} H_{0}}\right]$
d) $\left.\right|_{0} \overbrace{1}$


## Weak Coupling and

## Hybridization Expansion

$$
Z=\sum_{k=0}^{\infty} \int d \tau_{1} \cdots \int_{\tau_{k-1}}^{\beta} d \tau_{k} \operatorname{Tr}\left[e^{-\beta H_{0}} e^{\tau_{k} H_{0}}(-V) \cdots e^{-\left(\tau_{2}-\tau_{1}\right) H_{0}}(-V) e^{-\tau_{1} H_{0}}\right] .
$$

Two complementary approaches: Expansion in the interaction (e.g. the 'Hubbard U')


Expansion in the hybridization


$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow}
$$

Hopping exact

$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow} . ~ \$
$$

Any analytical diagrammatic expansion can be converted into a QMC algorithm!

## Advantages of Continuous Time QMC

No Approximations



> General interactions (e.g. exchange \& pair hopping), new physics

Speedup of about a factor of $10^{3}$ :
Intuitive picture: Smooth functions (diagrams) need to be approximated by a discretized version; resolution needs to be about 10 times larger than the features. Numerical effort is cubic $\left(\mathrm{O}\left(\mathrm{N}^{3}\right)\right)$ for all algorithms


## Discretization Errors



No discretization of the imaginary time interval as in Hirsch-Fye is necessary, extrapolation is avoided from the start.

## Performance Comparison



Gull,Werner, Troyer, Millis, Phys. Rev. B 76, 235I23 (2007)

## Performance Comparison


A. N. Rubtsov and A. I. Lichtenstein, JETP Letters 80,6I (2004)

## Weak Coupling Algorithm

Weak coupling partition function expansion (SIAM):

$$
\begin{aligned}
\frac{Z}{Z_{0}} & =\sum_{k=0}^{\infty} \frac{(-U)^{k}}{k!} \iiint_{0}^{\beta} d \tau_{1} \cdots d \tau_{k} \sum_{s_{1} \cdots s_{k}} \prod_{\sigma}\left\langle T_{\tau}\left[n_{\sigma_{1}}\left(\tau_{1}\right)-\alpha_{s_{1} \sigma_{1}}\right] \cdots\left[n_{\sigma_{k}}\left(\tau_{k}\right)-\alpha_{s_{k} \sigma_{k}}\right]\right\rangle \\
& =\sum_{k=0}^{\infty} \frac{(-U)^{k}}{k!} \iiint_{0}^{\beta} d \tau_{1} \cdots d \tau_{k} \sum_{s_{1} \cdots s_{k}} \prod_{\sigma} \operatorname{det} D_{k}^{\sigma}
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\end{aligned}
$$

Monte Carlo
sampling process:


## Weak Coupling Algorithm

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\end{aligned}
$$



Monte Carlo

sampling process:
a! 碞 !

## Weak Coupling Algorithm

Weak coupling partition function expansion (SIAM):

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\end{aligned}
$$



Monte Carlo
b) $\left.\right|_{0} ^{\text {Kow }}$ K K K K K K


## Weak Coupling Algorithm

Weak coupling partition function expansion（SIAM）：

$$
\begin{aligned}
\frac{Z}{Z_{0}} & =\sum_{k=0}^{\infty} \frac{(-U)^{k}}{k!} \iiint_{0}^{\beta} d \tau_{1} \cdots d \tau_{k} \sum_{s_{1} \cdots s_{k}} \prod_{\sigma}\left\langle T_{\tau}\left[n_{\sigma_{1}}\left(\tau_{1}\right)-\alpha_{s_{1} \sigma_{1}}\right] \cdots\left[n_{\sigma_{k}}\left(\tau_{k}\right)-\alpha_{s_{k} \sigma_{k}}\right]\right\rangle \\
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\end{aligned}
$$



Green＇s function lines

Monte Carlo sampling process：


a）！緅
碞 碞 ！
Vertex removal．

## Weak Coupling Algorithm

Weak coupling partition function expansion (SIAM):

$$
\begin{aligned}
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\end{aligned}
$$



Green's function lines

Monte Carlo sampling process:
a)

K
K


c) $\left.\right|_{0} K$


领!
Vertex removal.

## Weak Coupling Algorithm

Weak coupling partition function expansion (SIAM):

$$
\begin{aligned}
\frac{Z}{Z_{0}} & =\sum_{k=0}^{\infty} \frac{(-U)^{k}}{k!} \iiint_{0}^{\beta} d \tau_{1} \cdots d \tau_{k} \sum_{s_{1} \cdots s_{k}} \prod_{\sigma}\left\langle T_{\tau}\left[n_{\sigma_{1}}\left(\tau_{1}\right)-\alpha_{s_{1} \sigma_{1}}\right] \cdots\left[n_{\sigma_{k}}\left(\tau_{k}\right)-\alpha_{s_{k} \sigma_{k}}\right]\right\rangle \\
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\end{aligned}
$$



Green's function lines

Monte Carlo sampling process:
a) $\left.\right|_{0} ^{5}$
$K$
$K$
$K$
$K$


c) $\left.\right|_{0}$ K
2) !


Vertex shift.

## Weak Coupling Algorithm

Weak coupling partition function expansion (SIAM):

$$
\begin{aligned}
\frac{Z}{Z_{0}} & =\sum_{k=0}^{\infty} \frac{(-U)^{k}}{k!} \iiint_{0}^{\beta} d \tau_{1} \cdots d \tau_{k} \sum_{s_{1} \cdots s_{k}} \prod_{\sigma}\left\langle T_{\tau}\left[n_{\sigma_{1}}\left(\tau_{1}\right)-\alpha_{s_{1} \sigma_{1}}\right] \cdots\left[n_{\sigma_{k}}\left(\tau_{k}\right)-\alpha_{s_{k} \sigma_{k}}\right]\right\rangle \\
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\end{aligned}
$$



Green's function lines

Monte Carlo sampling process:
a) $\mid$ K
碞
維


c) $\left.\right|_{0} ^{\text {K }}$

K
Vertex removal.
d)

Vertex shift.

## Continuous-Time Auxiliary Field

Decoupling of the interaction with an auxiliary field:

Partition function expansion in the interaction representation:

$$
\begin{aligned}
1-\frac{\beta U}{K}\left(n_{i \uparrow} n_{i \downarrow}-\frac{n_{i \uparrow}+n_{i \downarrow}}{2}\right) & =\frac{1}{2} \sum_{s= \pm 1} \exp \left(\gamma s\left(n_{i \uparrow}-n_{i \downarrow}\right)\right), \\
\cosh (\gamma) & =1+\frac{U \beta}{2 K} .
\end{aligned}
$$

$$
Z=\sum_{k=0}^{\infty} \sum_{s_{1}, \cdots s_{k}= \pm 1} \int_{0}^{\beta} d \tau_{1} \cdots \int_{\tau_{k-1}}^{\beta} d \tau_{k}\left(\frac{K}{2 \beta}\right)^{k} Z_{k}\left(\left\{s_{k}, \tau_{k}\right\}\right)
$$

$$
Z_{k}\left(\left\{s_{i}, \tau_{i}\right\}\right) \equiv \operatorname{Tr} \prod_{i=k}^{1} \exp \left(-\Delta \tau_{i} H_{0}\right) \exp \left(s_{i} \gamma\left(n_{\uparrow}-n_{\downarrow}\right)\right)
$$

## Continuous-Time Auxiliary Field

Decoupling of the interaction with an auxiliary field:

Partition function expansion in the interaction representation:

Diagrams of the partition function:

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$$

## Continuous-Time Auxiliary Field

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$$

$$
Z_{k}\left(\left\{s_{i}, \tau_{i}\right\}\right) \equiv \operatorname{Tr} \prod_{i=k}^{1} \exp \left(-\Delta \tau_{i} H_{0}\right) \exp \left(s_{i} \gamma\left(n_{\uparrow}-n_{\downarrow}\right)\right) .
$$ Sampling:

$$
\begin{aligned}
1-\frac{\beta U}{K}\left(n_{i \uparrow} n_{i \downarrow}-\frac{n_{i \uparrow}+n_{i \downarrow}}{2}\right) & =\frac{1}{2} \sum_{s= \pm 1} \exp \left(\gamma s\left(n_{i \uparrow}-n_{i \downarrow}\right)\right), \\
\cosh (\gamma) & =1+\frac{U \beta}{2 K} .
\end{aligned}
$$



## Hybridization Expansion

Expansion in the interaction representation, where $V=H_{m i x}, H_{0}=H_{l o c}$. Density - density interactions.

$$
\begin{aligned}
Z & =\operatorname{Tr} e^{-\beta H}=\operatorname{Tr}\left[e^{-\beta H_{0}} T_{\tau} e^{-\int_{0}^{\beta} d \tau H_{\text {mix }}(\tau)}\right] \\
& =\sum_{k=0}^{\infty} \int d \tau_{1} \cdots \int_{\tau_{k-1}}^{\beta} d \tau_{k} \operatorname{Tr}\left[e^{-\beta H_{0}} e^{\tau_{k} H_{0}}\left(-H_{\text {mix }}\right) \cdots e^{-\left(\tau_{2}-\tau_{1}\right) H_{0}}\left(-H_{\text {mix }}\right) e^{-\tau_{1} H_{0}}\right]
\end{aligned}
$$

Configurations


## Hybridization - General Interactions

More complicated interactions (clusters, multiorbital, phonons, ...)?

Configuration of $H_{l o c}$
Configuration of $V$


$$
\begin{aligned}
Z & =\operatorname{Tr} e^{-\beta H}=\operatorname{Tr}\left[e^{-\beta H_{0}} T_{\tau} e^{-\int_{0}^{\beta} d \tau H_{\text {mix }}(\tau)}\right] \\
& =\sum_{k=0}^{\infty} \int d \tau_{1} \cdots \int_{\tau_{k-1}}^{\beta} d \tau_{k} \operatorname{Tr}\left[e^{-\beta H_{0}} e^{\tau_{k} H_{0}}\left(-H_{\text {mix }}\right) \cdots e^{-\left(\tau_{2}-\tau_{1}\right) H_{0}}\left(-H_{\text {mix }}\right) e^{-\tau_{1} H_{0}}\right]
\end{aligned}
$$

occupation number basis $\left[H_{\mathrm{loc}}, S_{z}\right]=0=\left[H_{\mathrm{loc}}, N\right]$ further symmetries

$H_{\text {loc }}$

$H_{\text {loc }}$

$H_{\text {loc }}$

$\operatorname{Tr}[$

$c_{\uparrow}^{\dagger}$

$e^{-H_{\text {loc }} \tau_{2}}$

$\left.e^{-H_{\text {loc }} \tau_{3}} \ldots\right]$

## Choosing the appropriate Algorithm

Large cluster calculations: Continuous-time auxiliary field method (up to $10 \times 10$ clusters)


Problems with density density interactions, many orbitals: Hybridization expansion (linear in the number of orbitals)


Problems with general but weak interactions:Weak Coupling expansion
Problems with general interactions but few orbitals: Hybridization expansion.

## Cluster Dynamical Mean Field Theory

Maier et al., Rev. Mod. Phys. 77, 1027 (2005)
Hubbard model on 2d square lattice:

$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow} .
$$




8 -site cluster


Tiling of the BZ

Restriction to paramagnetic bath

$$
\epsilon_{p}=-2 t\left(\cos \left(p_{x}\right)+\cos \left(p_{y}\right)\right)-4 t^{\prime} \cos \left(p_{x}\right) \cos \left(p_{y}\right)
$$

DCA self energy is chosen to be constant within patches of the Brillouin zone.
8 -site (cluster): clear node / antinode distinction. Regions away from the Fermi surface (at zero and $(\pi, \pi)$ ) are not mixed in with regions around the FS.

## Cluster Dynamical Mean Field Theory

Maier et al., Rev. Mod. Phys. 77, 1027 (2005)
Hubbard model on 2d square lattice:

$$
H=-\sum_{\langle i j\rangle, \sigma} t_{i j}\left(c_{i \sigma}^{\dagger} c_{j \sigma}+c_{j \sigma}^{\dagger} c_{i \sigma}\right)+U \sum_{i} n_{i \uparrow} n_{i \downarrow} .
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8 -site cluster


Tiling of the BZ

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$t^{\prime}=-0.15 t$
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$\mathrm{t}^{\prime}=-0.3 \mathrm{t}$
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## Results: Doping Driven Transition

Spectral function $\mathrm{A}(0)$ at the Fermi energy as a function of chemical potential exhibits clear crossing points.

Sector $C$ transition occurs before sector $B$ transition. Transitions coalesce on the electron doped side for larger $t$ ', but not on the hole doped side.



For large electron and hole doping: behavior consistent with Fermi liquid theory.

For intermediate doping: $\mathrm{A}(0)$ is suppressed in comparison with FL, possible Non-FL phase in sector B.

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## Conclusions

For a review on continuous-time algorithms see my PhD thesis http://e-collection.ethbib.ethz.ch/view/eth:31103

Open source codes: In preparation, will be published this summer as part of the ALPS (alps.comp-phys.org) libraries.

New algorithms allow access to new physics: Larger systems, extrapolation to the infinite system, general interactions, and more orbitals.


