

# **Nonequilibrium Physics of Correlated Electron Materials III:**

## **Numerics and Model Systems**

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**College de France**

**Oct 5, 2015**

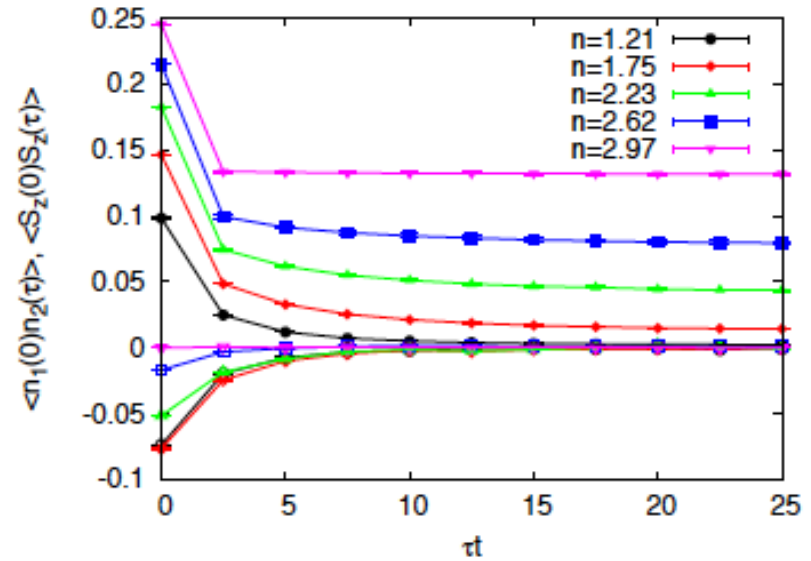
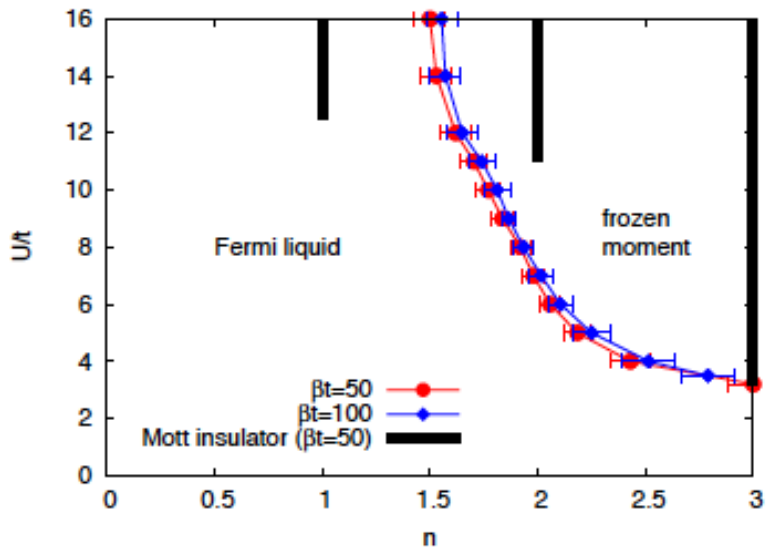
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# Numerically Exact Methods can bring surprises

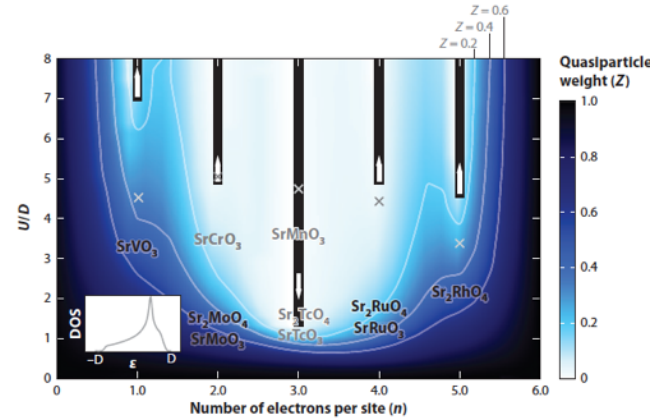
## Spin Freezing Multiorbital Hubbard Models



# New insights into materials

## Strong Correlations from Hund's Coupling

Antoine Georges,<sup>1,4,5</sup> Luca de' Medici,<sup>2,3</sup> and Jernej Mravlje<sup>1,4,6</sup>



## electronic correlations in iron arsenide superconductors

### New Journal of Physics

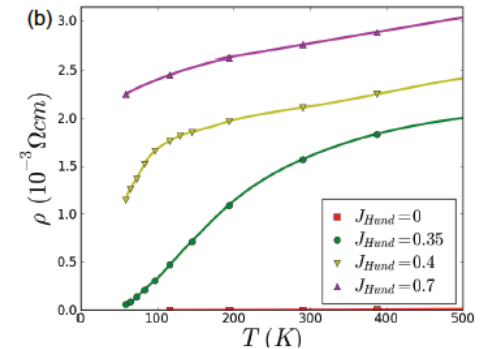
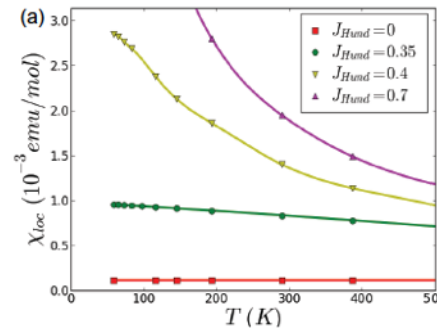
The open-access journal for physics

#### Coherence–incoherence crossover in the normal state of iron oxypnictides and importance of Hund's rule coupling

K Haule<sup>1</sup> and G Kotliar

Department of Physics, Rutgers University, Piscataway, NJ 08854, USA  
E-mail: [haule@physics.rutgers.edu](mailto:haule@physics.rutgers.edu)

New Journal of Physics 11 (2009) 025021 (13pp)



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# **Numerically exact methods for nonequilibrium physics needed**



**the subject presents two difficulties:**

- **The correlated electron part**
- **The nonequilibrium part**



# The correlated electron part: Two (nontrivial) solved problems

## 1. One dimensional models

**Time evolution of isolated quantum systems**

## 2. Zero dimensional models

**Open interacting systems**

**Approximation to lattice systems (DMFT)**



# The nonequilibrium part

**Correlation function:**

$$\chi_{RP}(t_1, t_2) = \text{Tr} \left[ e^{-iHt_2} \mathbf{R} e^{iH(t_2-t_1)} \mathbf{P} e^{-iHt_1} \rho_{\text{init}} \right]$$

**Typically requires time evolution forward from specified initial state.**

**Long times required to analyse steady state correlation functions**

**Direct numerical construction of steady state density matrix not yet much addressed**



# Quenches:

## Diagonalization and its generalizations

**Isolated quantum system started in an specific initial state (e.g. the ground state of a different H)**

$$|\psi(\mathbf{t})\rangle = \sum_{\mathbf{n}} e^{-i\mathbf{E}_{\mathbf{n}}\mathbf{t}} |\mathbf{n}\rangle \langle \mathbf{n} | \psi(\mathbf{t} = \mathbf{0}) \rangle$$

**Approach 1: diagonalize H. Obtain all states and energies**





# Rigol, arXiv:0908.3188

## Quenches in 1d systems:

$$\hat{H} = \sum_{i=1}^L \left\{ -t \left( \hat{f}_i^\dagger \hat{f}_{i+1} + \text{H.c.} \right) + V \left( \hat{n}_i - \frac{1}{2} \right) \left( \hat{n}_{i+1} - \frac{1}{2} \right) \right. \\ \left. - t' \left( \hat{f}_i^\dagger \hat{f}_{i+2} + \text{H.c.} \right) + V' \left( \hat{n}_i - \frac{1}{2} \right) \left( \hat{n}_{i+2} - \frac{1}{2} \right) \right\}$$

**Here  $t'$ ,  $V'$  are second neighbor couplings that break integrability**

**Spinless fermions. Can do up to  
~ 8 fermions up to ~24 sites**



# Rigol, arXiv:0908.3188

## Time dependent density matrix

$$\hat{\rho}(t) = \sum_{mn} e^{i(\mathbf{E}_n - \mathbf{E}_m)t} \psi_n^* \psi_m$$

$$\psi_m = \langle \mathbf{m} | \psi(t = 0) \rangle$$

At long times: diagonal?

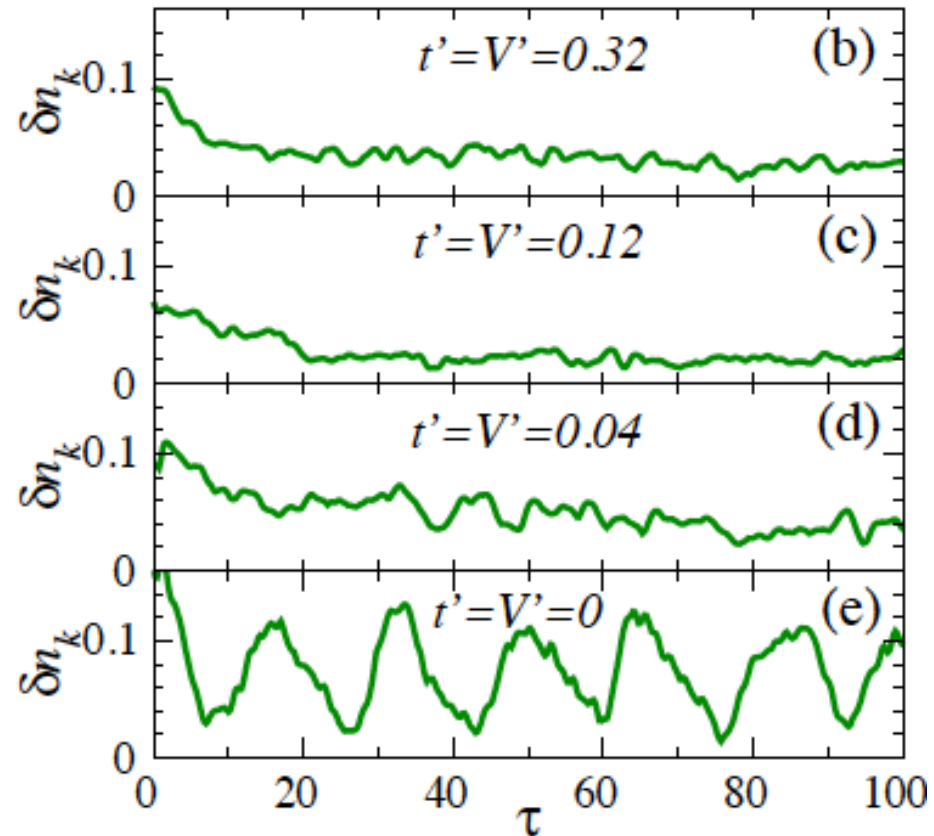
$$\hat{\rho}_{\text{diag}}(t) = \sum_{\mathbf{n}} |\psi_{\mathbf{n}}|^2$$



## Quenches in integrable and non-integrable models

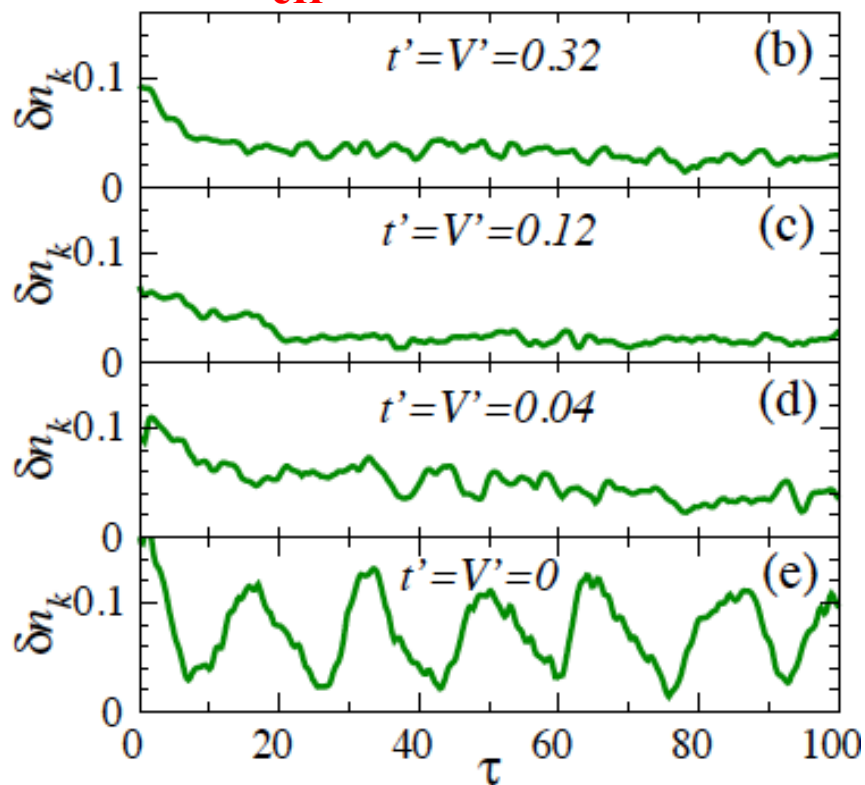
**Plot: difference between exact result and prediction of diagonal density matrix**

$$\delta n_k(\tau) = \frac{\sum_k |n(k, \tau) - n_{diag}(k)|}{\sum_k n_{diag}(k)}$$

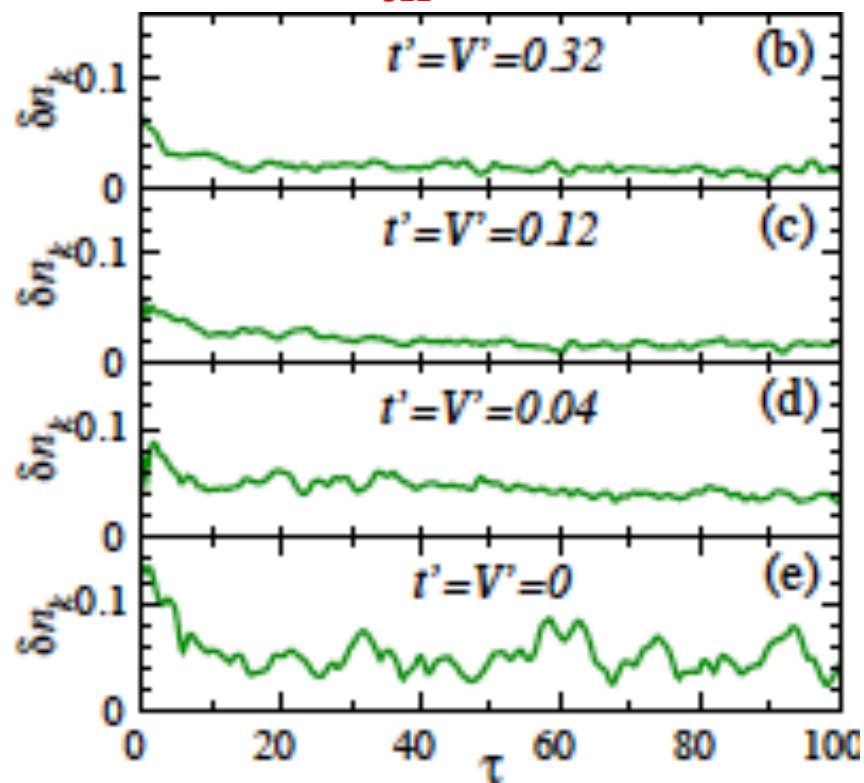


# As increase mean energy of quenched state, predictions get closer to those of diagonal ensemble—for non-integrable

$T_{\text{eff}}=2$



$T_{\text{eff}}=3$



# **Direct diagonalization: very suggestive but cant keep enough states to address basic questions**

- 1. How does deviation from diagonal density matrix scale with system size**
- 2. How does crossover from integrable to nonintegrable behavior scale with system size and temperature**
- 3.  $d > 1$ : need too many states to represent a system of interesting linear dimension**



**to improve diagonalization**

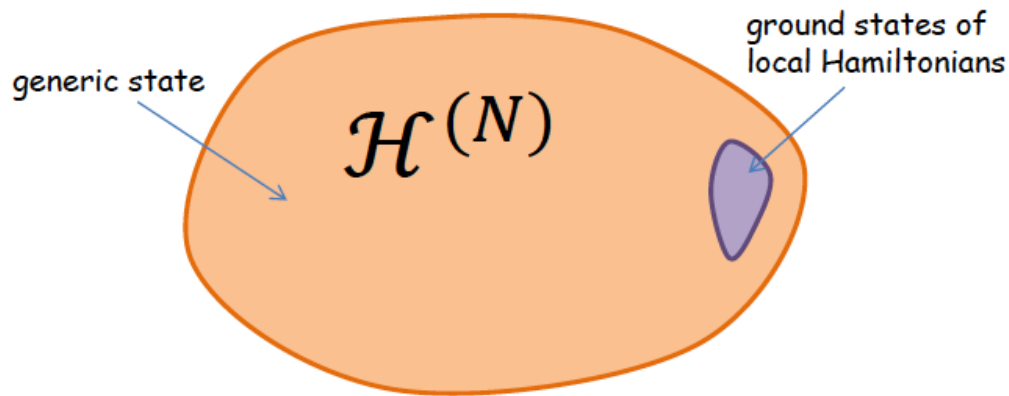
**operate in reduced basis**



# DMRG—MPS

## Basic observation: ground states are special

Ground states of local Hamiltonians are special/non-generic states

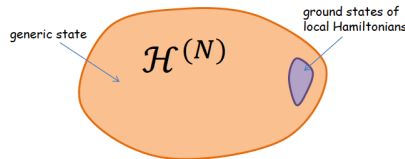


From G. Vidal

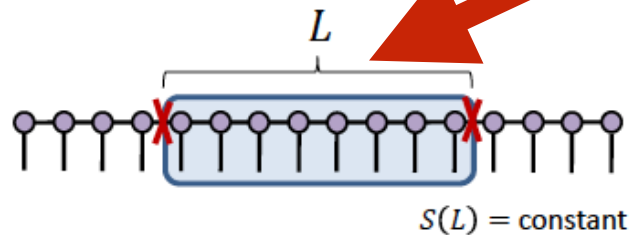
# special property of ground states: area law entanglement

(for gapped systems; 'pathological' exceptions exist)

Ground states of local Hamiltonians are special/non-generic states



Pick a subregion A



reduced density matrix  $\hat{\rho}_A = \text{Tr}_{B \notin A} [\hat{\rho}]$

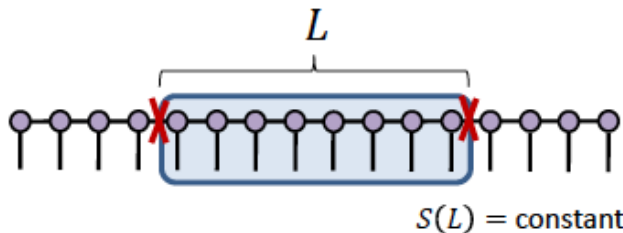
entanglement  
entropy

$$S_{A|\notin A} = -\text{Tr} [\rho_A \ln \rho_A]$$



# Density matrix eigenvalues

$$S_{A|\not{A}} = - \sum_{\lambda=1..D_A} w_\lambda \ln w_\lambda$$



**Size  $L \Rightarrow$  Hilbert space dimension  $D$  for region  $A$  is  $D_A = (\text{const})^L$**

**typical (excited) state of whole system: each eigenvalue.  $w$ , of reduced density matrix has magnitude  $\sim 1/D_A$**

$$S_{A|\not{A}} \approx -\ln \frac{1}{D_A} = L \ln(\text{cst})$$

# Ground states are different



# Area law for ground states (on reasonable assumptions)

$$S_{A|\complement A} \sim L^{d-1}$$

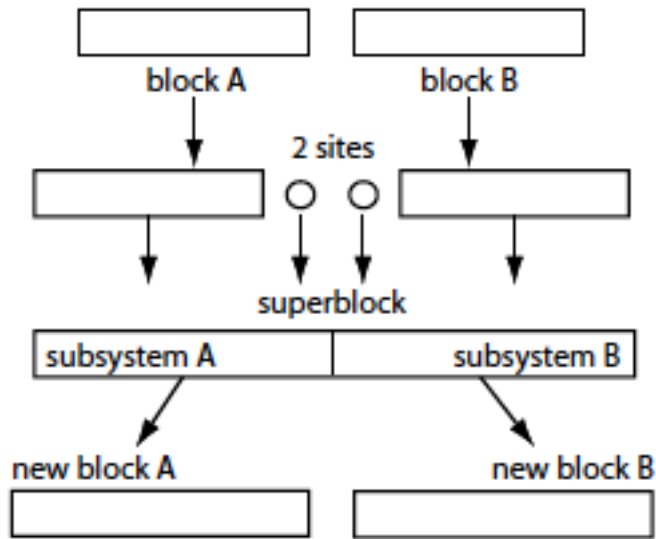
$$S_{A|\complement A} = - \sum_{\lambda=1..D_A} w_\lambda \ln w_\lambda$$

Implies reduced density matrix has a non-exponential number of non-negligible eigenvalues (indep of size of L in d=1). Eigenfunctions w big e.v. provide variational basis

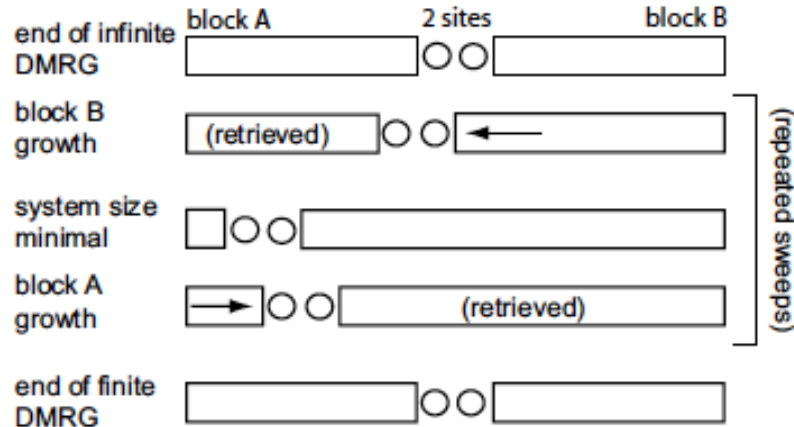


# Sketch of Algorithm for Ground State

1. start with variational basis, size  $2M$
2. partition system
3. add one site to each side
4. recompute reduced density matrix
5. New variational basis:  $M$  states with largest eigenvalues



# Improvement



1. start with result described above.
2. `sweep: remove sites from one side, view as new site on other, recompute reduced density matrix.

# Time dependence

**If Hamiltonian is sum of local terms:**

$$e^{iH\Delta t} \rightarrow 1 + i \sum_i h_i \Delta t$$

**Each term in sum is like a term in the 'sweep'**

**=> time dependence can be done with small modification of usual DMRG formalism**



**The catch: excited states are `typical`  
=>entanglement entropy~ volume**

**=>typically need exponentially many parameters**

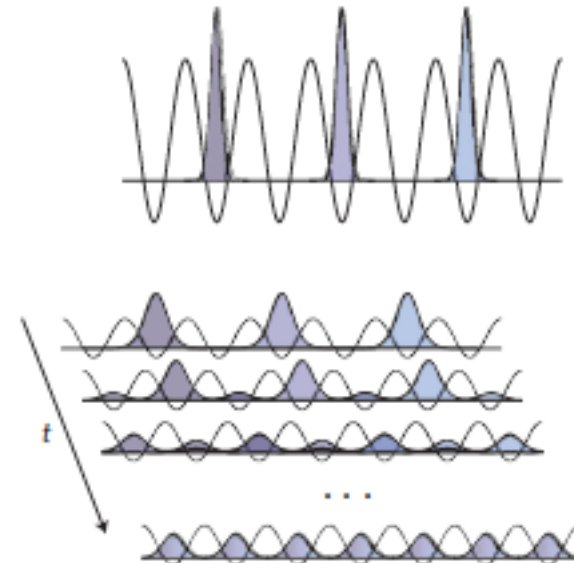
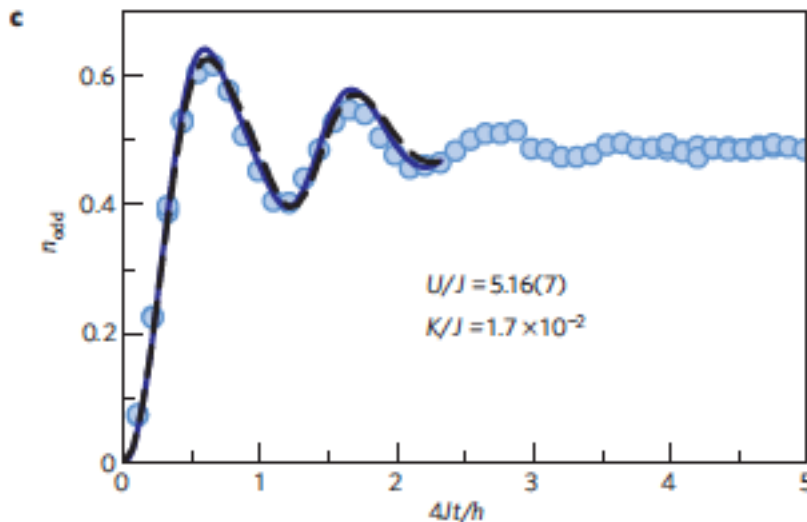
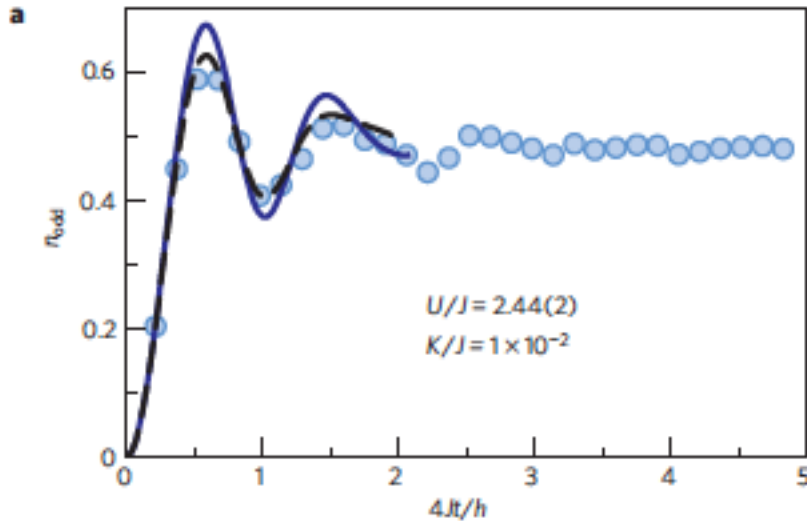
**1d, typical models have excitations propagating  
with non-zero velocity=> entanglement increases  
linearly with time => # of states to represent  
dynamics needed exponentially with time**

**Exponential wall: only question is how  
far can you go before you hit it**



# Trotzky et al Nature Physics vol 8 p 325

$$\hat{H} = \sum_i \left[ -J (\hat{a}_i^\dagger \hat{a}_{i+1} + \text{h.c.}) + \frac{U}{2} \hat{n}_i (\hat{n}_i - 1) + \frac{K}{2} \hat{n}_i^2 \right]$$



**Exponential wall at  $t=2J$**

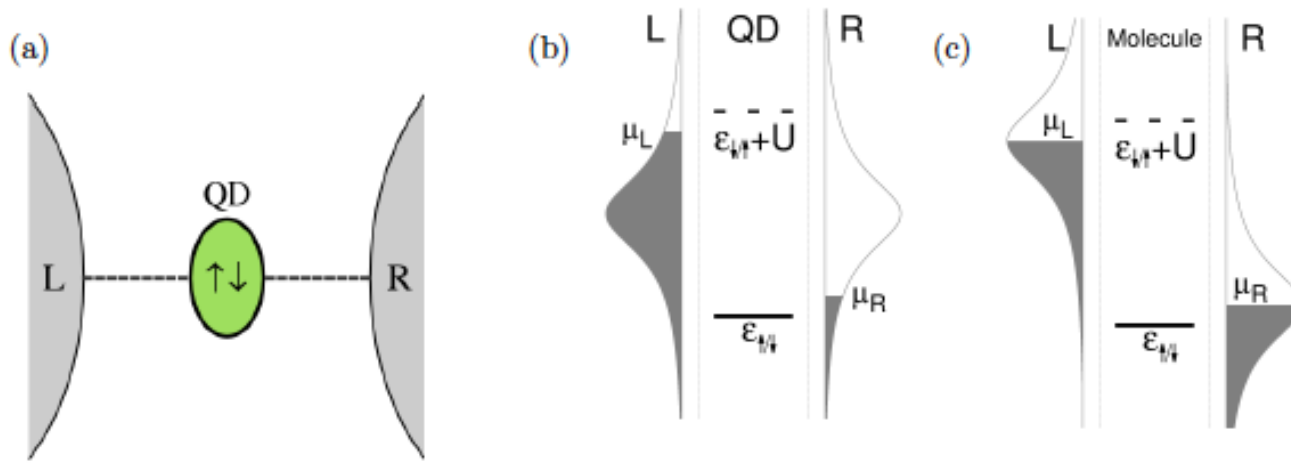


# State of the art: lattice systems

**Numerics can access short to intermediate times, can address many interesting questions, but exponential wall prevents access to long times.**



# Impurity models and dynamical mean field theory



**quantum impurity model: local interacting region sandwiched between two non-interacting leads**

# Hamiltonian

$$\begin{aligned} \mathbf{H} = & \sum_{ab} \mathbf{H}_{ab}^0 d_a^\dagger d_b + \sum_{abcd} \mathbf{I}^{abcd} d_a^\dagger d_b^\dagger d_c d_d \\ & + \sum_{akb} v^{akb} d_a^\dagger c_{kb} + \text{H.c.} + \sum_{kb} \epsilon_{kb} c_{kb}^\dagger c_{kb} \end{aligned}$$

**Local levels +interactions, coupled to leads**



# Alternative: integrate out bath

Action of 0 (space) +1 (time) d field theory

$$S = \int dt dt' d_a^\dagger(t) \Delta^{ab}(t, t') d_b(t') + I^{abcd} \int dt d_a^\dagger d_b^\dagger d_c d_d$$

$$\Delta^{ab} = \left( i\partial_t - H_{ab}^0 - \sum_{kc} V^{akc} G_{kc}(t_1, t_2) V^{bkc} \right)$$

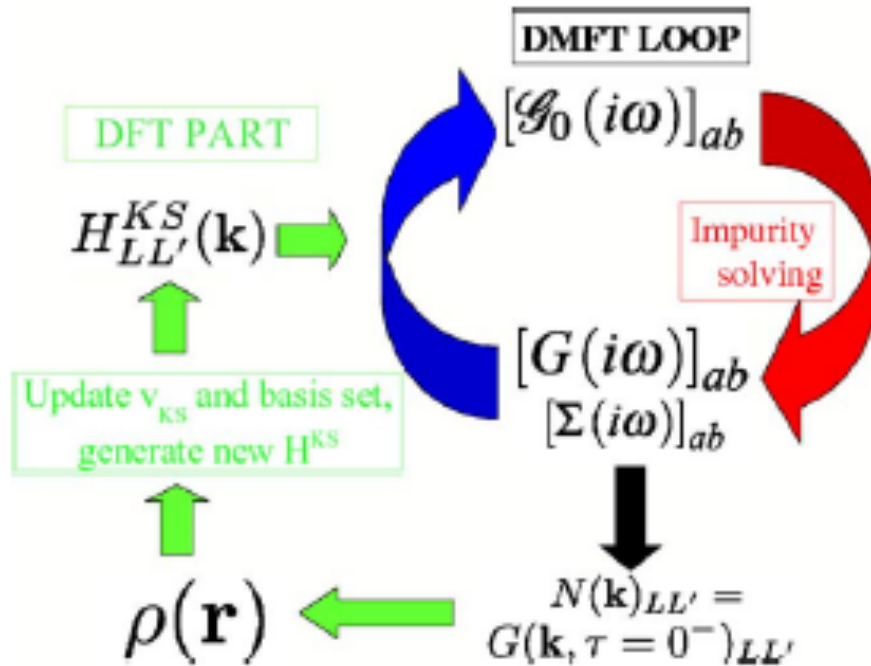


# Motivation

- 1. Model for quantum dots (in and out of equilibrium)**
- 2. Auxiliary problem for dynamical mean field theory: approximation for self energy of lattice model from solution of impurity model plus self-consistency condition. In and out of equilibrium**
- 3. Test-bed for methods**



# Equilibrium DMFT



**Impurity model with self-consistently chosen hybridization functional**

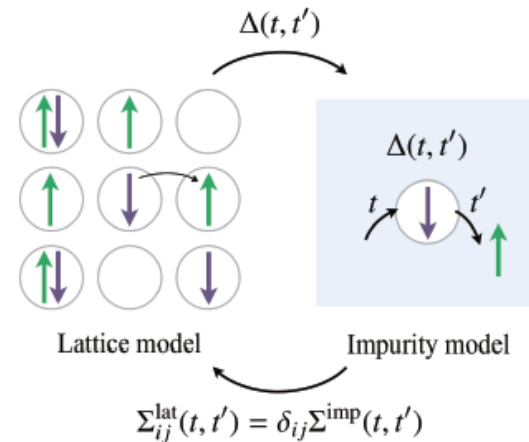
# Nonequilibrium DMFT

## Original formulation:

- Schmidt and Monien, arXiv:cond-mat/0202046
- Freericks, Turkowski, and Zlatic, PRL 97, 266408

Nice description of modern understanding

Aoki, Tsuji, Eckstein,  
Kollar, Oka, Werner,  
arXiv:1310.5329 (RMP  
2014)



# Specialize to single-orbital Anderson impurity model

$$\mathbf{H} = \varepsilon \sum_{\sigma} d_{\sigma}^{\dagger} d_{\sigma} + U \mathbf{n}_{\uparrow} \mathbf{n}_{\downarrow} \\ + \mathbf{H}_{\text{mix}} + \mathbf{H}_{\text{bath}}$$

**Charge density**     $\mathbf{n} = \mathbf{n}_{\uparrow} + \mathbf{n}_{\downarrow}$

**Spin density**     $\mathbf{m} = \mathbf{n}_{\uparrow} - \mathbf{n}_{\downarrow}$



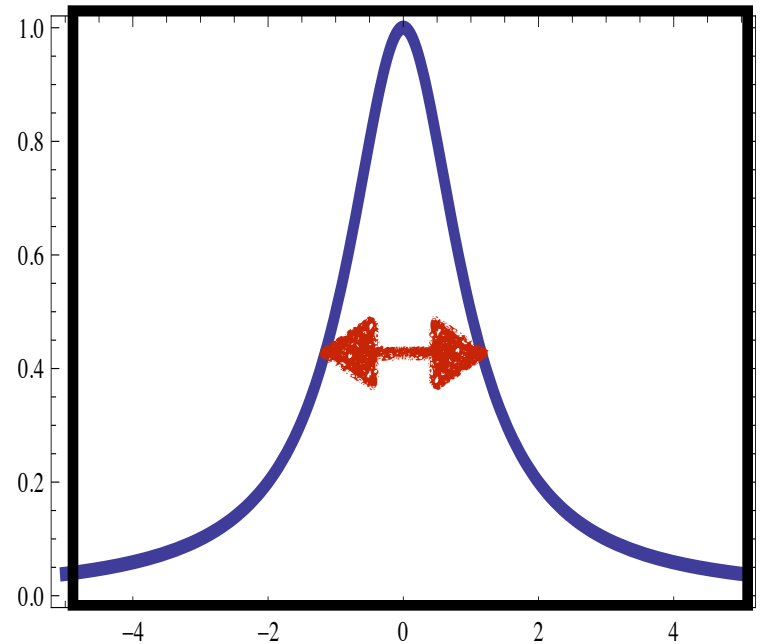


# Nonequilibrium

- 1. Time dependence of parameters in  $H$**
- 2. Different chemical potentials for different baths.**



Parameter: bare  
level width  $\Gamma$

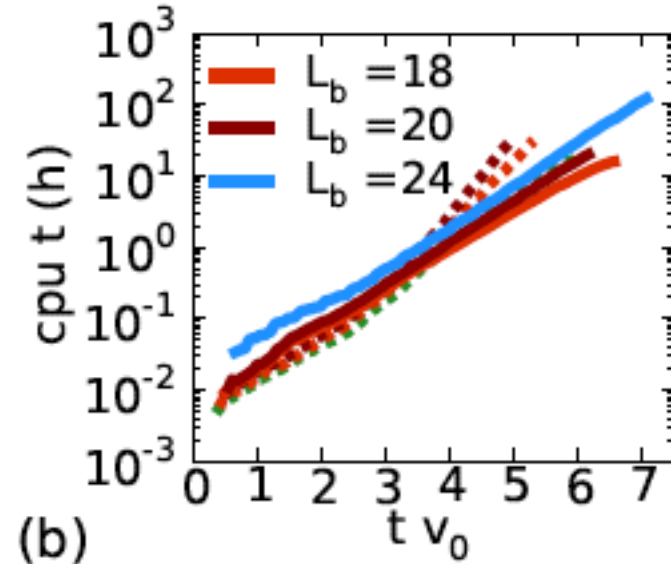
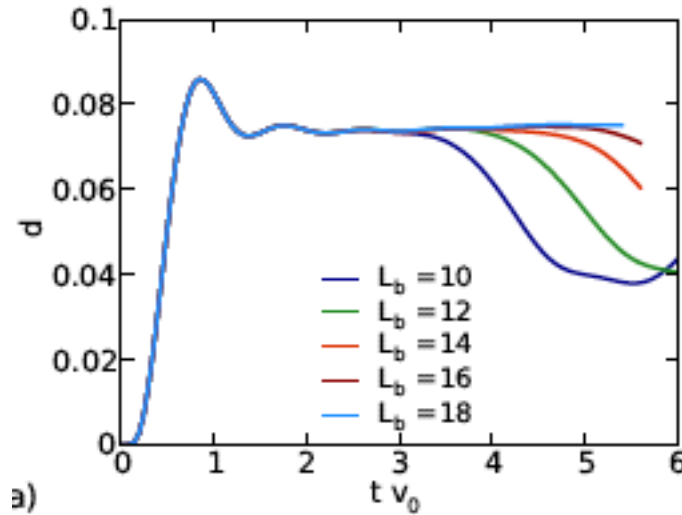


# To solve impurity model

1. **Approximate methods**
2. **Discretize bath—diagonalize**
3. **Quantum Monte Carlo**



# DMRG as real-time impurity solver



**Can reach times of order 5 before growth  
of entanglement wins**

**Long enough for equilibrium response  
functions**

**??Steady state nonequilibrium studies??**

# Quantum Monte Carlo

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# **Equilibrium: propagation on imaginary time contour**

**efficiently performed by continuous time  
quantum Monte Carlo**



# Continuous time Monte Carlo:

$$\mathbf{H} = \mathbf{H}_a + \mathbf{H}_b$$

- interaction representation with respect to  $\mathbf{H}_b$

$$Z = \text{Tr} T_\tau e^{-\beta H_a} \exp \left[ - \int_0^\beta d\tau H_b(\tau) \right]$$

- formal expansion in  $\mathbf{H}_b$

$$\begin{aligned} &= \sum_k (-1)^k \int_0^\beta d\tau_1 \dots \int_{\tau_{k-1}}^\beta d\tau_k \\ &\quad \times \text{Tr} [e^{-\beta H_a} H_b(\tau_k) H_b(\tau_{k-1}) \dots H_b(\tau_1)] \end{aligned}$$

- sample series stochastically



# Two expansions

$$\begin{aligned} \mathbf{H} = & \sum_{ab} \mathbf{H}_{ab}^0 d_a^\dagger d_b + \sum_{abcd} \mathbf{I}^{abcd} d_a^\dagger d_b^\dagger d_c d_d \\ & + \sum_{akb} \mathbf{V}^{akb} d_a^\dagger c_{kb} + \mathbf{H.c} + \sum_{kb} \epsilon_{kb} c_{kb}^\dagger c_{kb} \end{aligned}$$

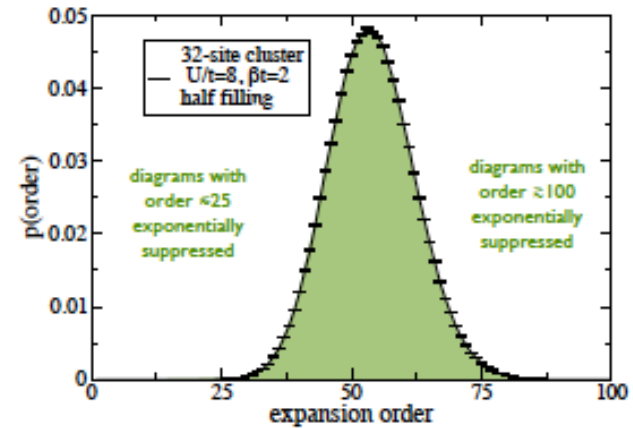
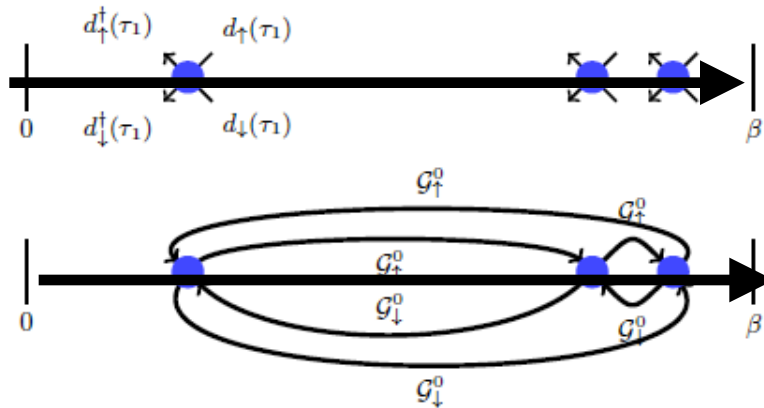
**In interactions**  
**In hybridization**

**In equilibrium: both series**  
**absolutely convergent at**  
**any  $T > 0$**





# Equilibrium CT-QMC:



**Number of vertices  
needed set by  $1/T$**

**Works very well because  
the method is estimating a  
real exponential**

**Method is now very  
widely used.**

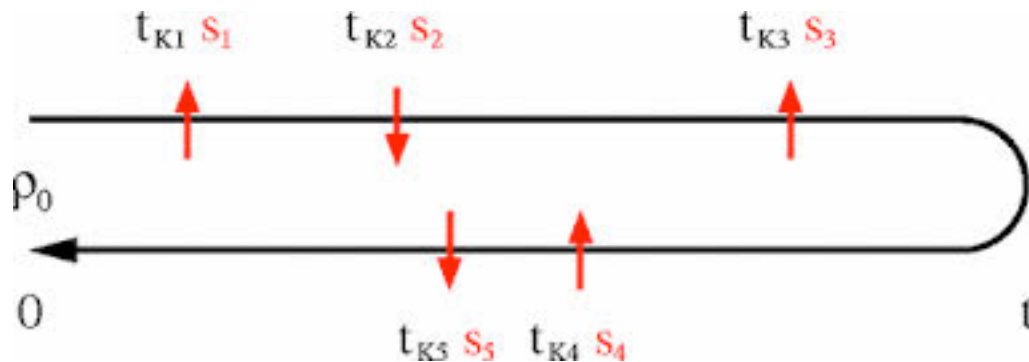
$$\mathbf{Z} = \text{Tr} \left[ e^{-\beta \mathbf{H}} \right]$$



# Out of equilibrium

$$\langle \hat{O} \rangle_t = \text{Tr} \left[ \hat{O} \hat{\rho}(t) \right] = \text{Tr} \left[ \hat{O} e^{-i\hat{H}t} \hat{\rho}_0 e^{i\hat{H}t} \right]$$

- Real time evolution forward from initial condition
- Number of vertices  $\sim$  time interval
- **Two time contours required (twice as many vertices)**
- **Convergence by cancellation of oscillations**



# Hybridization vs Interaction Expansion

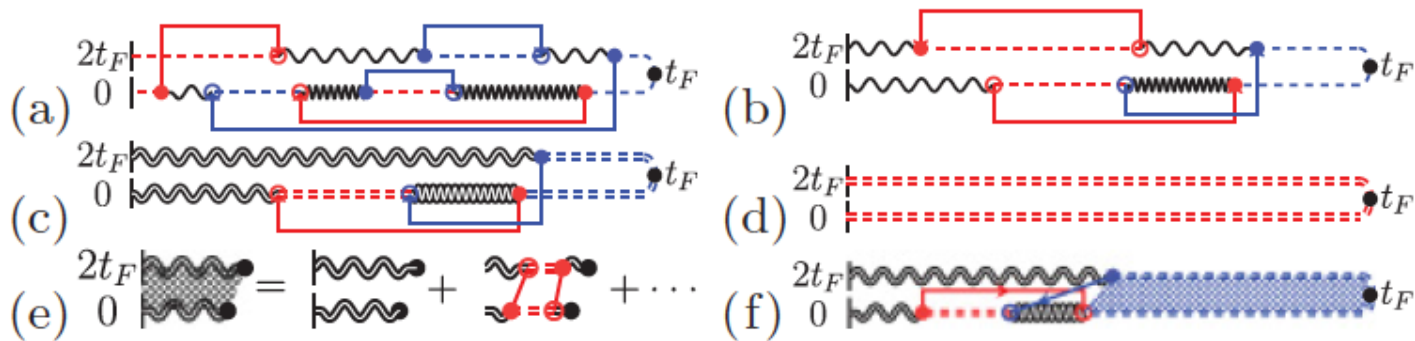
$$\begin{aligned} \mathbf{H} = & \sum_{ab} \mathbf{H}_{ab}^0 d_a^\dagger d_b + \sum_{abcd} \mathbf{I}^{abcd} d_a^\dagger d_b^\dagger d_c d_d \\ & + \sum_{akb} \mathbf{V}^{akb} d_a^\dagger c_{kb} + \text{H.c.} + \sum_{kb} \epsilon_{kb} c_{kb}^\dagger c_{kb} \end{aligned}$$

**Expand in I: use bare Green functions which include nonequilibrium—expansion can be formulated directly in nonequilibrium steady state**

**Expand in V: necessarily start in wrong state**



# perturbation expansion: diagrammatics on Keldysh contour



# 2009: brute force approach



# Real time CT-QMC

(stochastically explore bare perturbation theory)



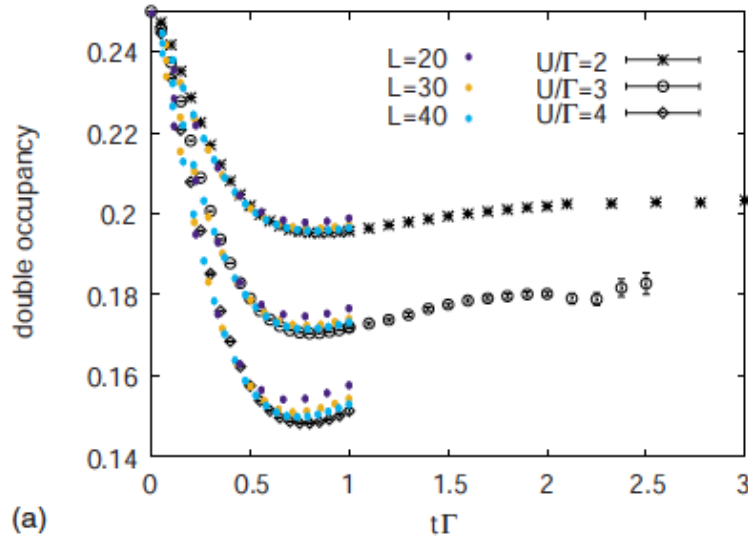
# Real time CT-QMC

(stochastically explore bare perturbation theory)

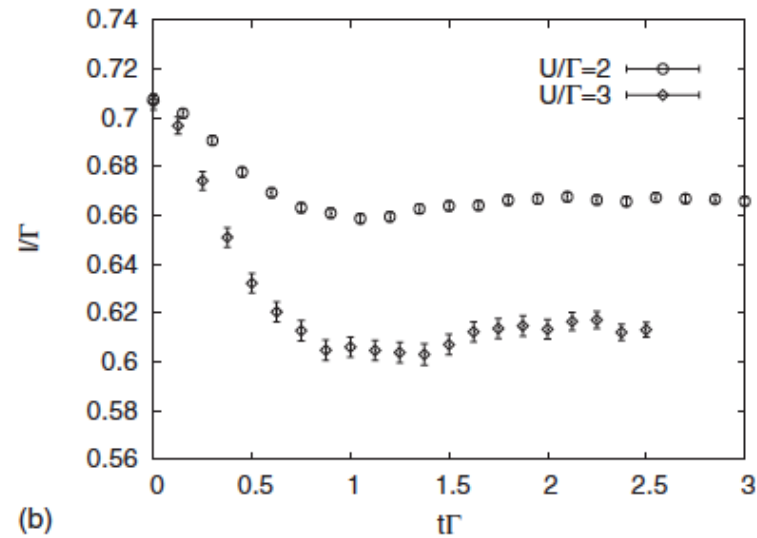
Results for Anderson model

(single level quantum dot with 2 leads)

Real time, equilibrium



Current at non-zero voltage



Werner-Millis  
Rabani-Muhlbacher  
Schiro-Fabrizio

**At interesting coupling strengths, method  
is limited to brutally short times.**



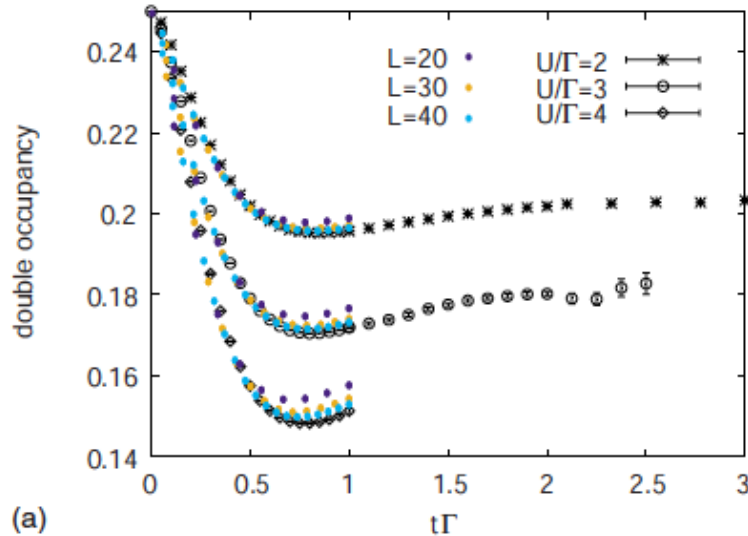
# Real time CT-QMC

(stochastically explore bare perturbation theory)

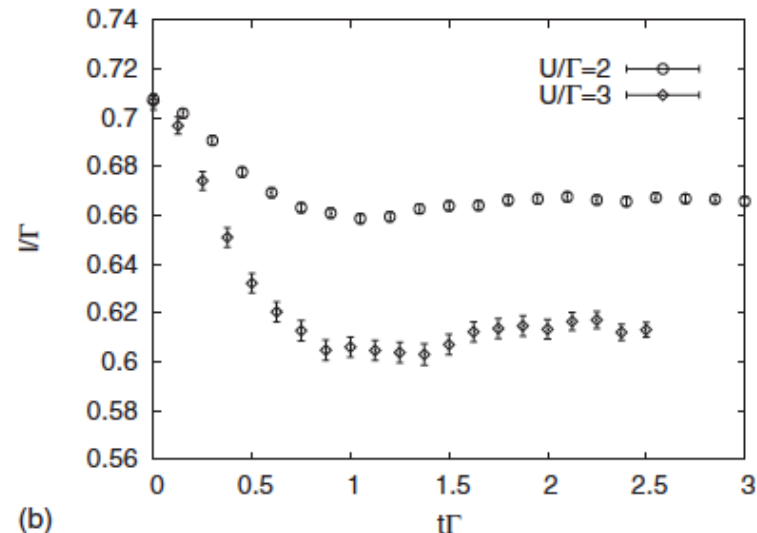
Results for Anderson model

(single level quantum dot with 2 leads)

Real time, equilibrium



Current at non-zero voltage



One time quantities  
(densities) easiest to  
calculate

Werner-Millis  
Rabani-Muhlbacher  
Schiro-Fabrizio

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# Technical point

**In real time, convergence with respect to diagram order occurs when sum of all diagrams of a given order decreases rapidly with order.**

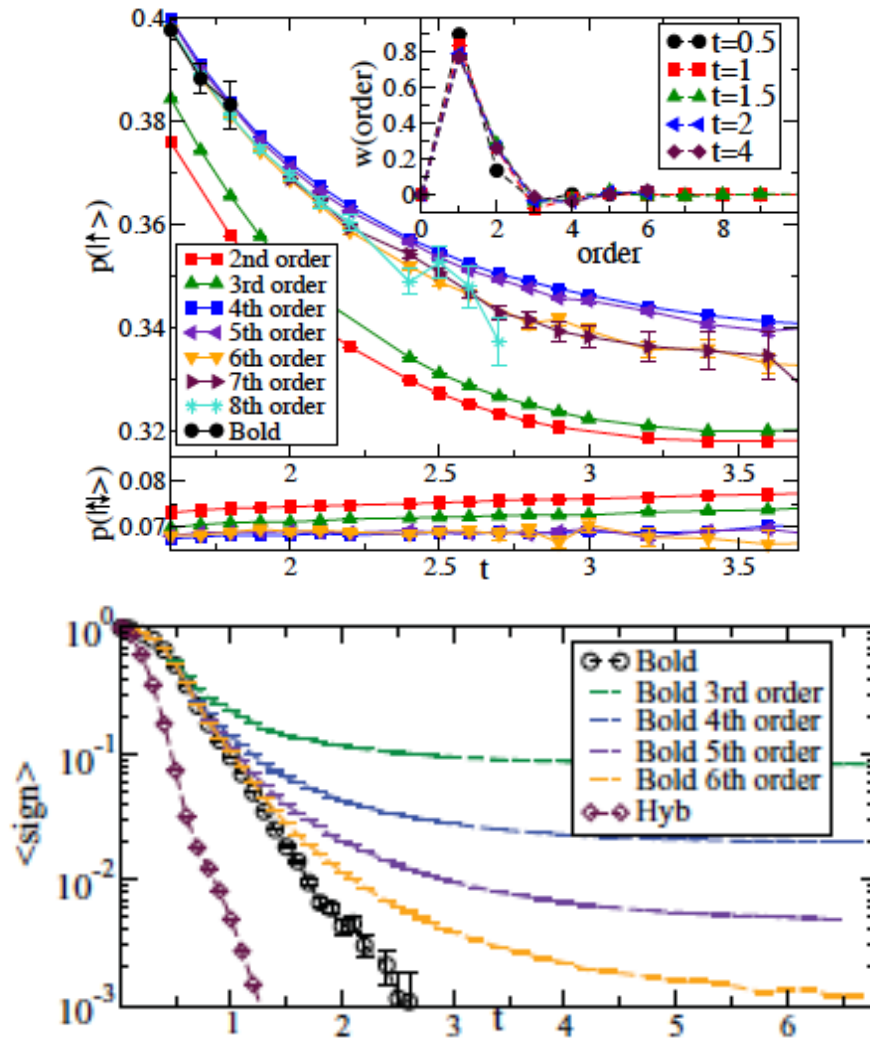
**This cancellation of diagrams (“sign blessing”—N. Prokof’ev) is problematic for Monte Carlo**

**Solution: put hard wall in calculation (no diagrams of order  $n > N_{\max}$ ). Then systematically increase  $N_{\max}$  until convergence achieved**



# Convergence with respect to order and time

**Method works if calculations converges at a low enough order that the sign does not kill you. Low T and strong interactions are hard to do**



Gull Reichman Milli arXiv:1105.1175s



# First Improvement: 'Bold' methods

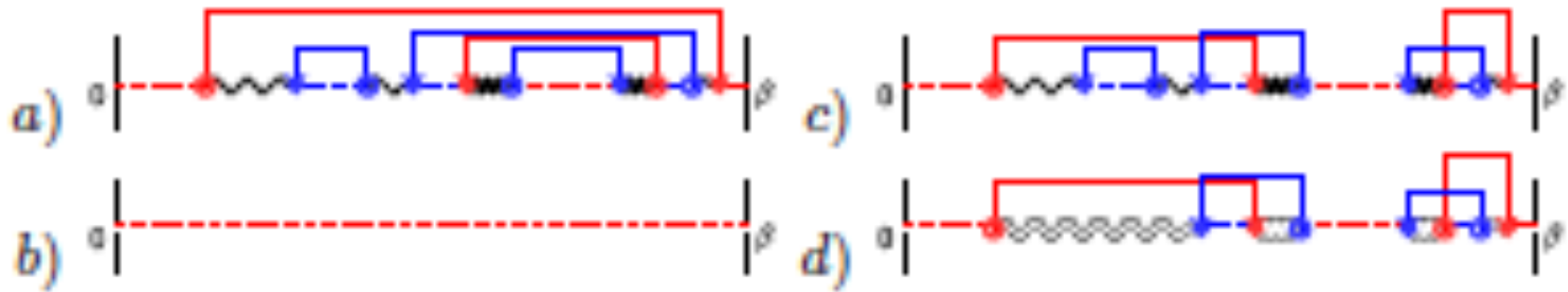
**Idea: perform stochastic expansion around partial resummation of diagram series. Partial resummation can be done by solving ``simple'' integral equation**

**What you lose: Wick's theorem**

**What you gain: fewer corrections needed (if partial resummation is good starting point)**



**'NCA' (non-crossing approximation):  
resummation of all diagrams with no crossing  
hybridization lines  
or 'OCA' (one crossing approx)**

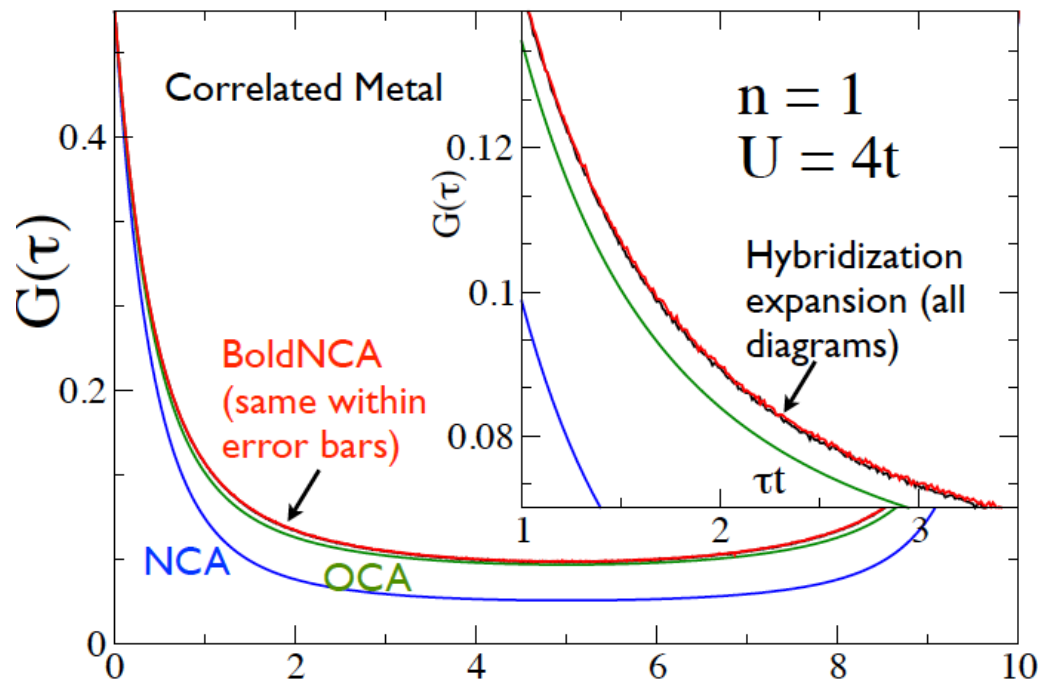


**Corrections to NCA by Monte-Carlo**



# Test in equilibrium

Compare to exact results (here,  
DMFT, Hubbard model)



**NCA: poor in metallic phase**  
(OK in Mott insulator)

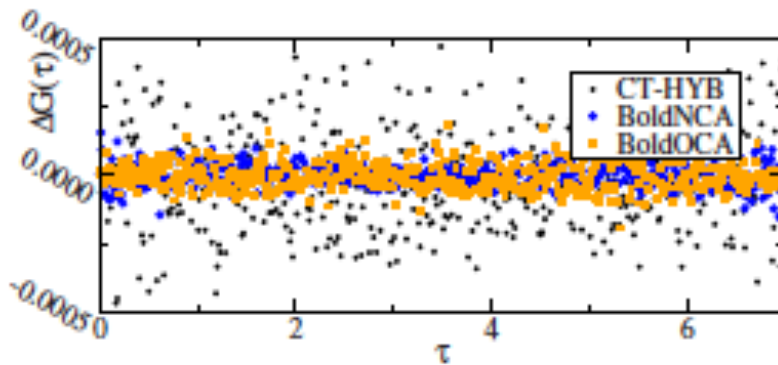
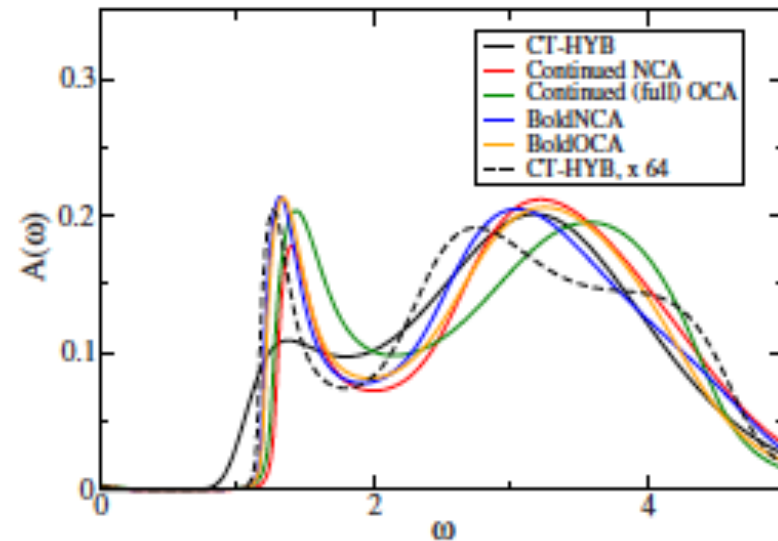
**OCA good.**

**Bold—agrees with CT-QMC within error**



# Structure at lower gap edge of Hubbard model

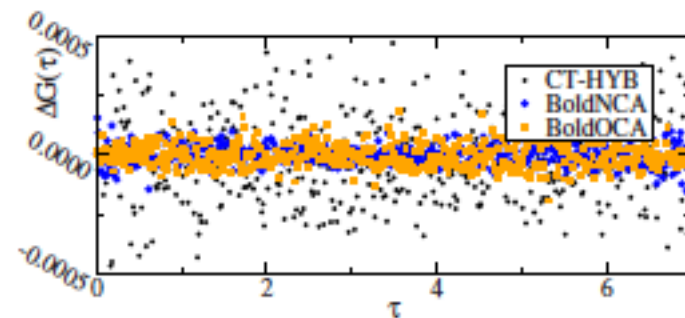
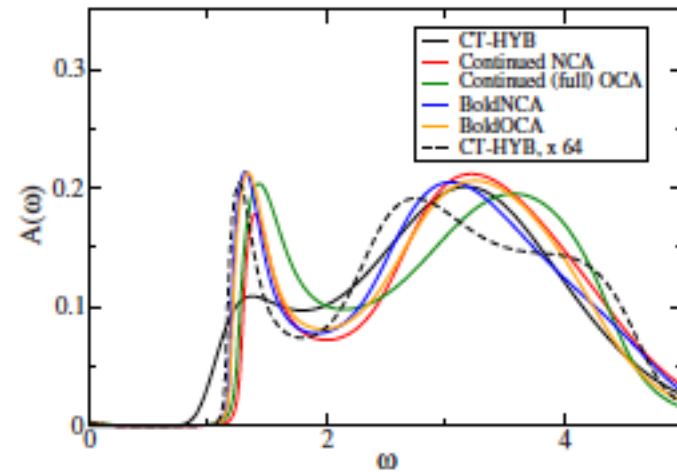
**Bold method:**  
significantly higher accuracy  $\Rightarrow$  decent analytical continuation possible—but throwing more CPUs at standard CT-QMC gets same result



# Remark

**In equilibrium, bold methods not very useful for the quantum impurity models needed for DMFT**

**What you gain by expanding around a better starting point is not enough more than what you lose by no Wick's theorem except in a few cases**



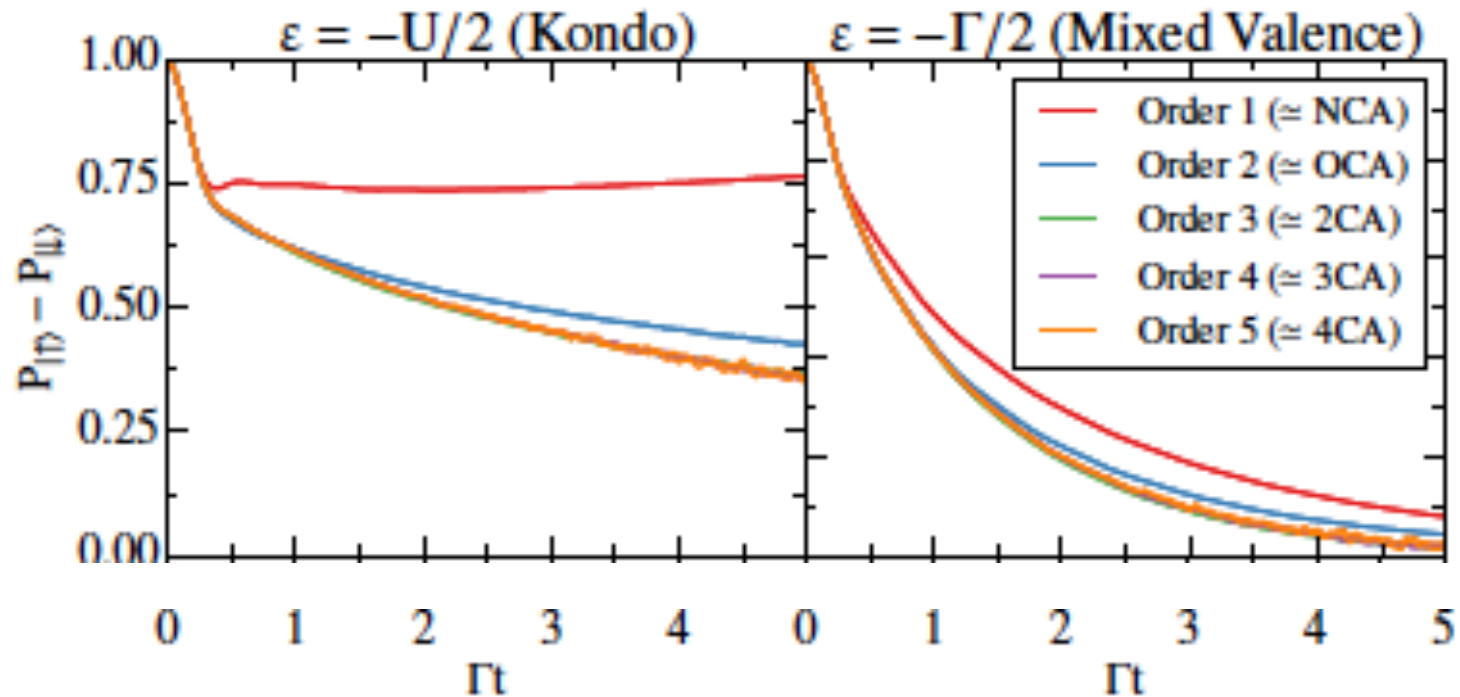
# Nonequilibrium Results (quantum dot with voltage drop $V$ )



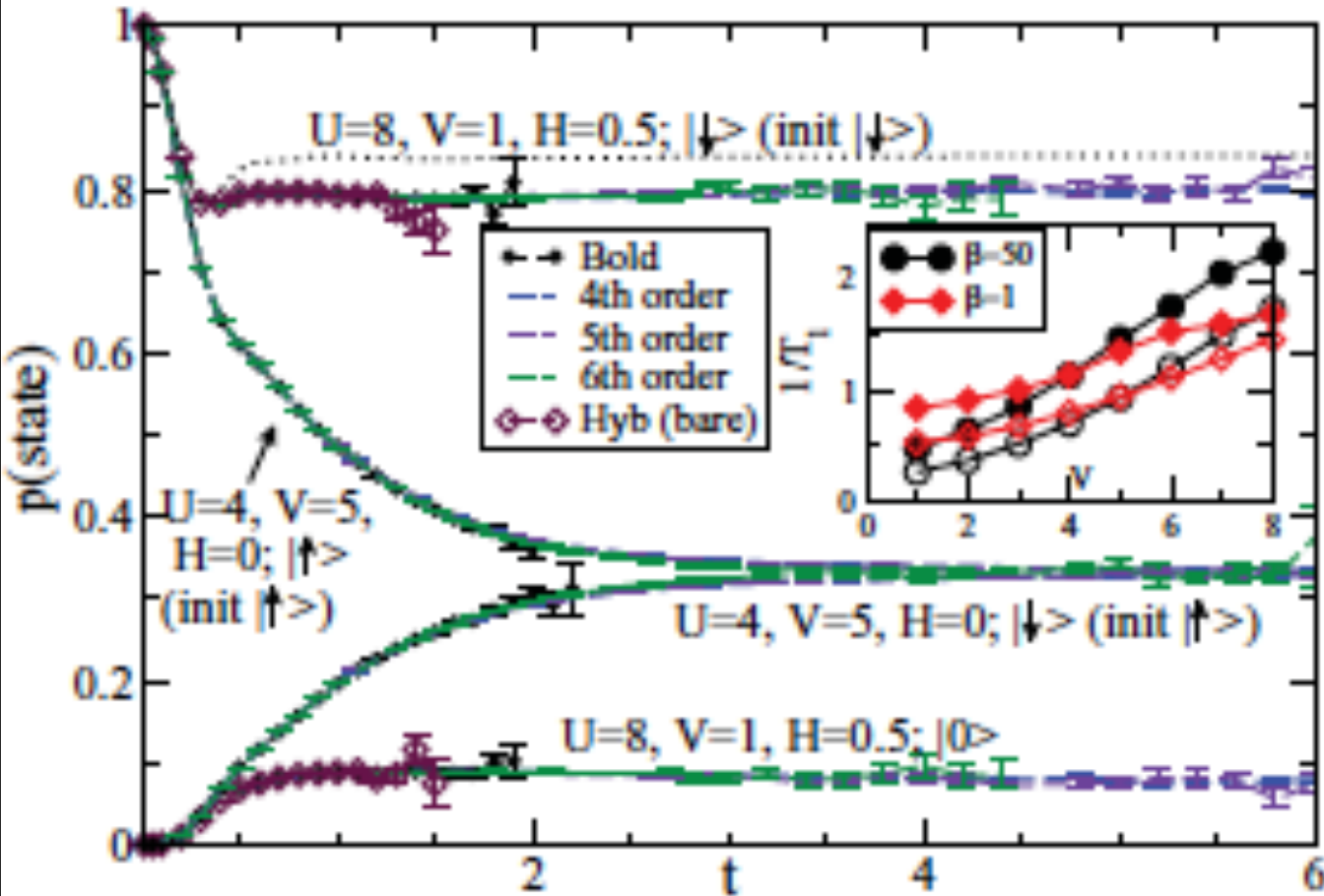


# Test out of equilibrium

## Magnetization



# Magnetization relaxation



**nb: density is easy to get right. spin dynamics is real test of method**

**NCA good for elements of density matrix;  
bad (~factor of 2) for relaxation times**



**Bold expansion: accessible region  $\sim 5 \times \Gamma$  not long enough!**

**New refinement (Cohen/Rabani): long timescale comes from small value of relaxation time. But relaxation time is determined by short time physics accessible to bold CT-QMC**



# Zwanzig-Mori Memory kernel

Equation for reduced density matrix:

$$i \frac{d\sigma}{dt} = [\mathbf{H}_{\text{impurity}}, \sigma] - i \int_0^t dt_1 \kappa(t_1) \sigma(t - t_1)$$

$\kappa(t_1)$ : relaxation kernel  
computable by diagrams



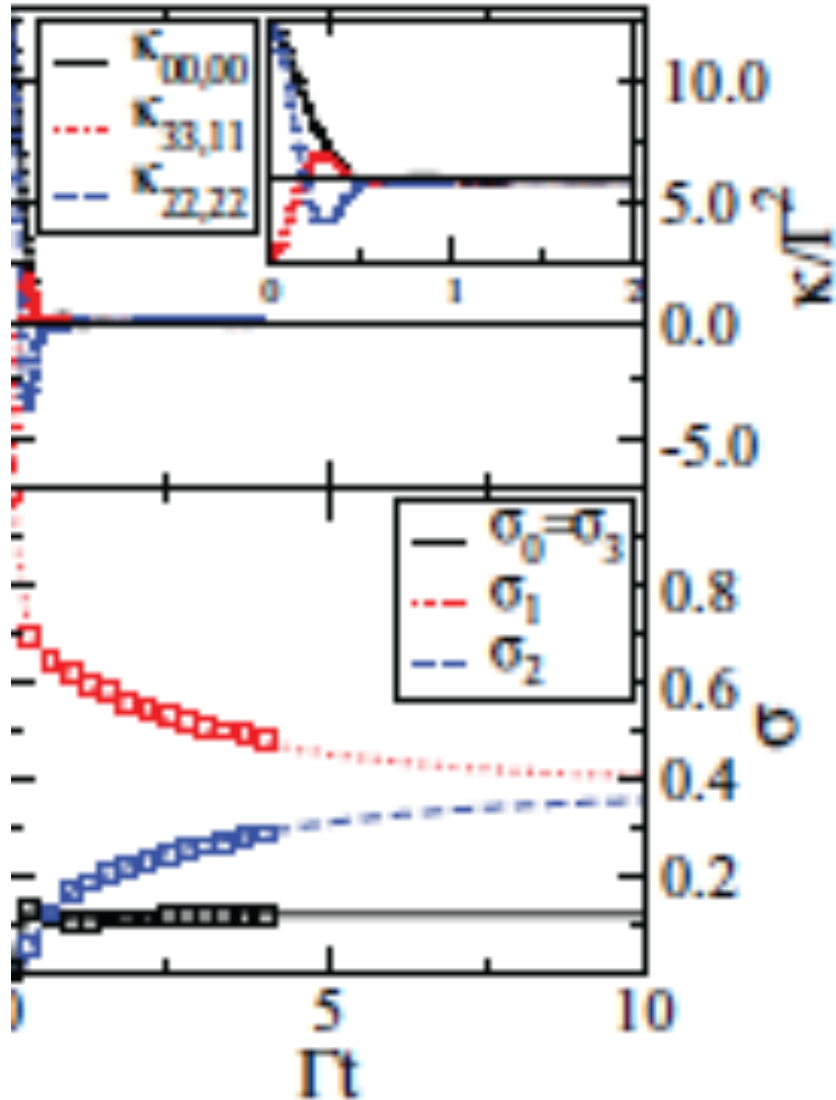
# Idea

**Compute relaxation kernel using diagrams up to time  $t$ . Then use computed kernel to evaluate physical properties to longer times.**

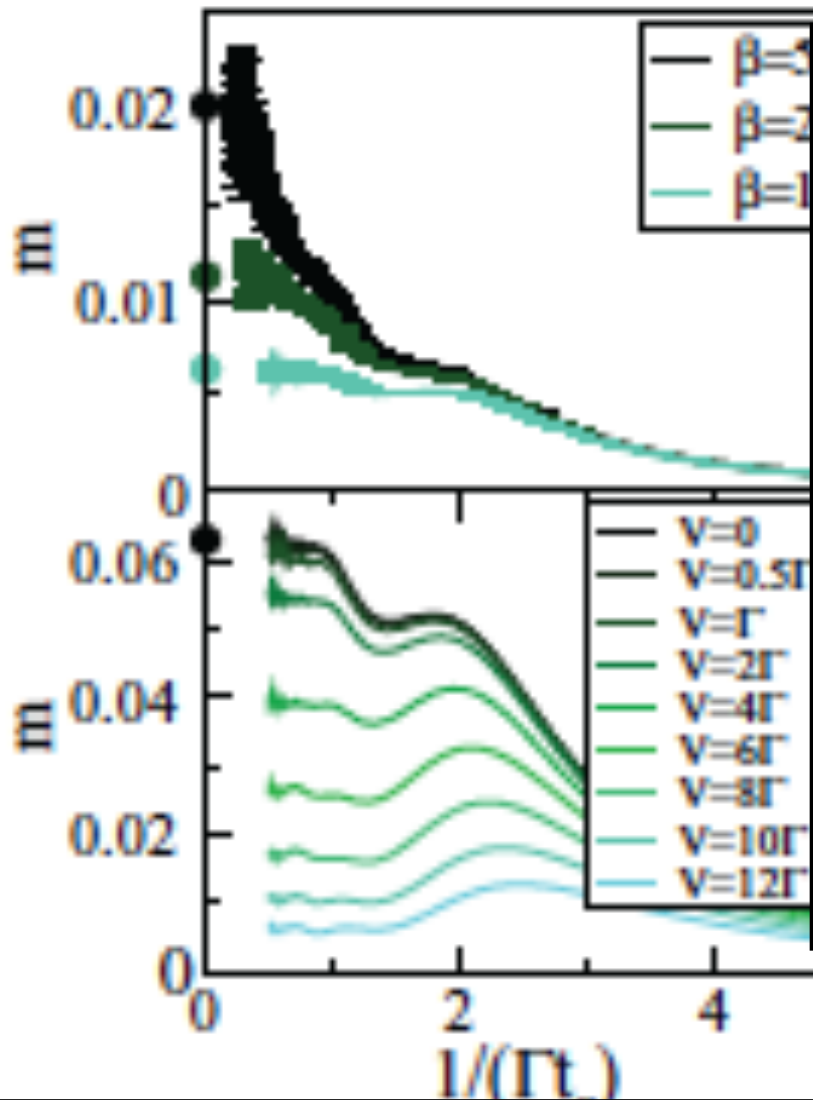
**Convergence tests again crucial**



# Example



# Memory methods: convergence is tricky

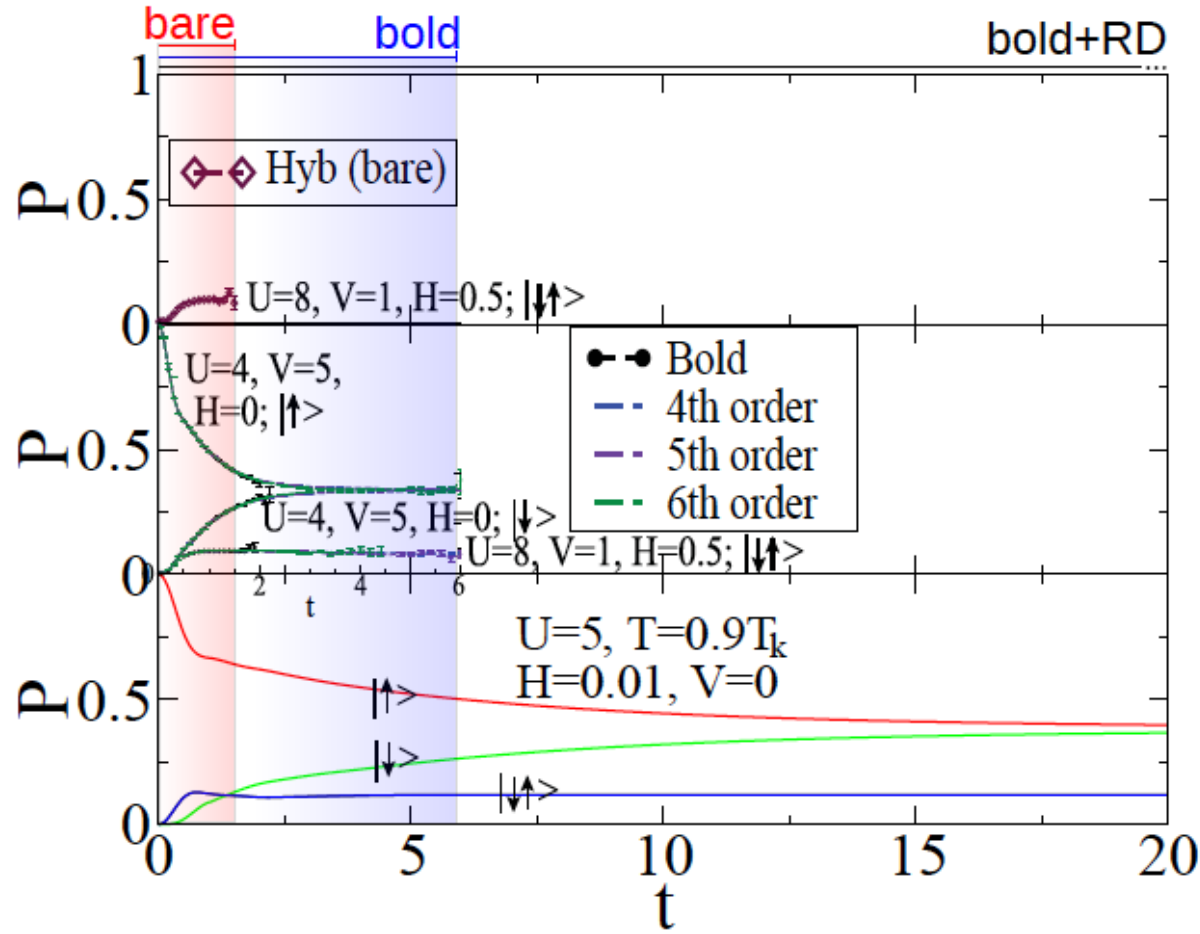


**Equilibrium**

**Open question: long-time  
tail of kernel in FL regime**



# Memory method: results



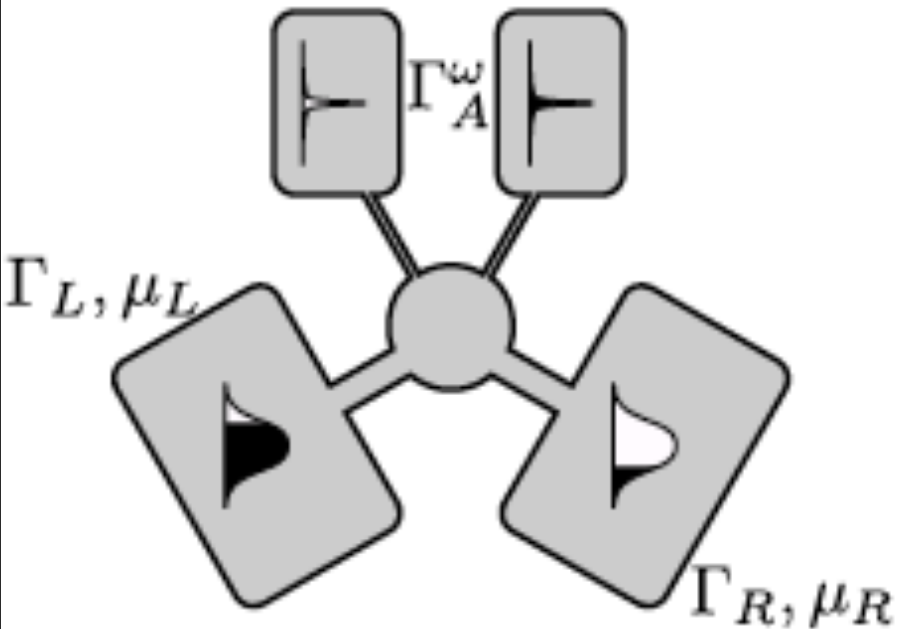


**Bold+Memory gets you to long time  
(at not too low T)**

**BUT—what it gives you is the density matrix.  
How to get the Green function???**



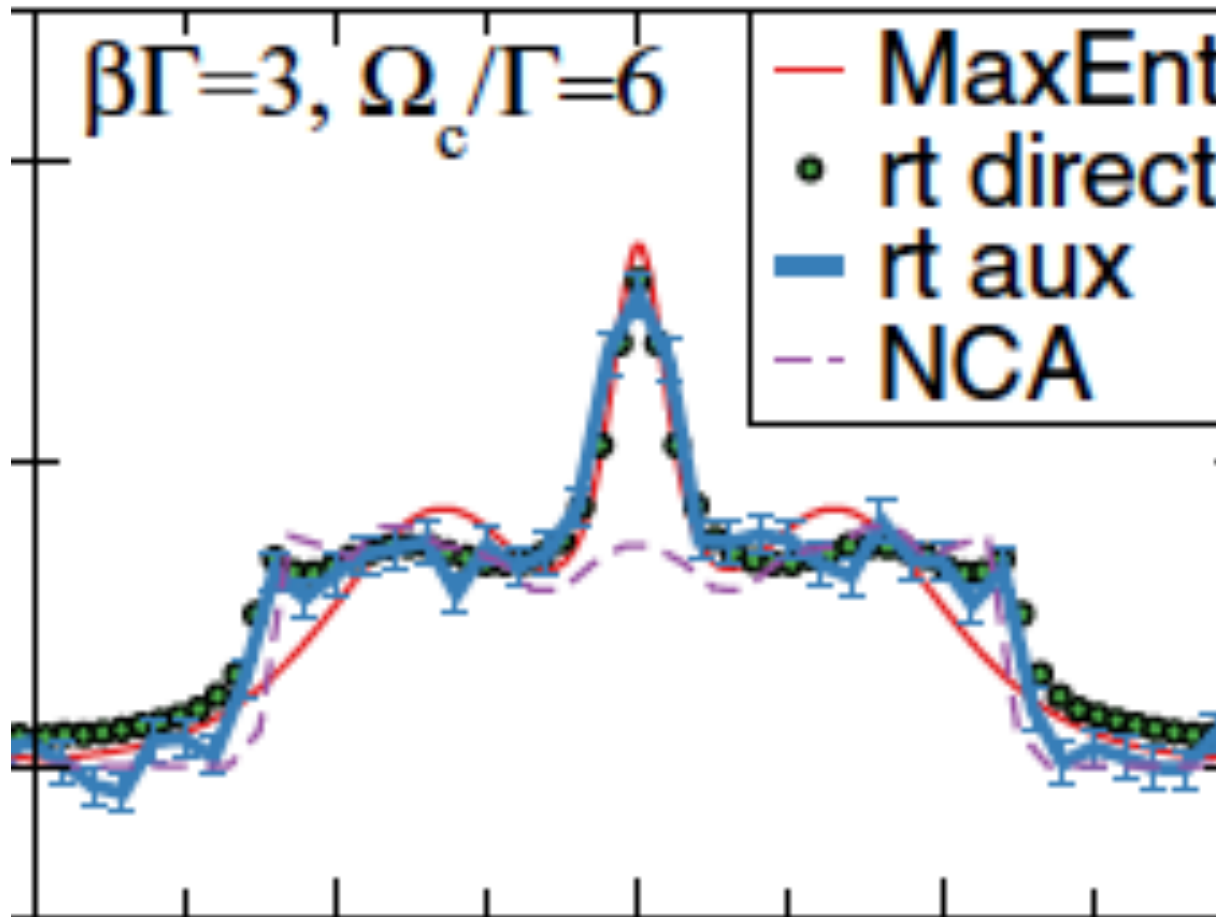
# The Greens function (a two-time observable)



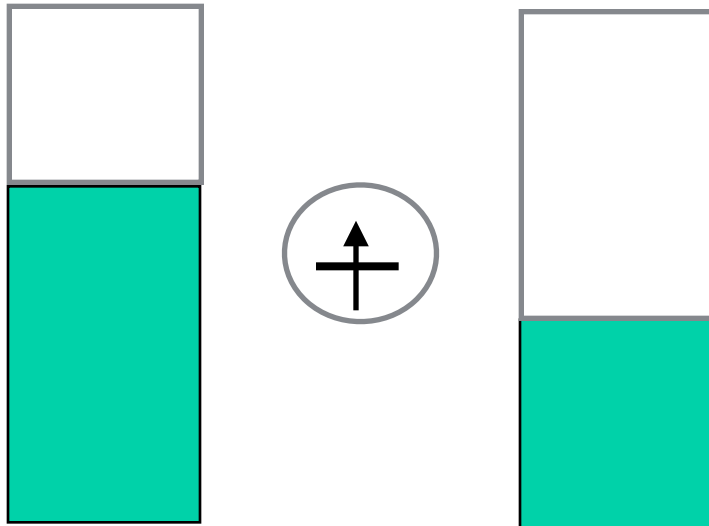
**Guy Cohen: add two auxiliary leads, one to add and one to remove particles in a narrow energy range**

$$A_{\text{aux}}(\omega, t) = \lim_{\eta \rightarrow 0} -\frac{2h}{e\pi\eta} [I_A^f(\omega, t) - I_A^e(\omega, t)]$$

# Test: equilibrium spectral function



# Physics question: nonequilibrium Kondo effect



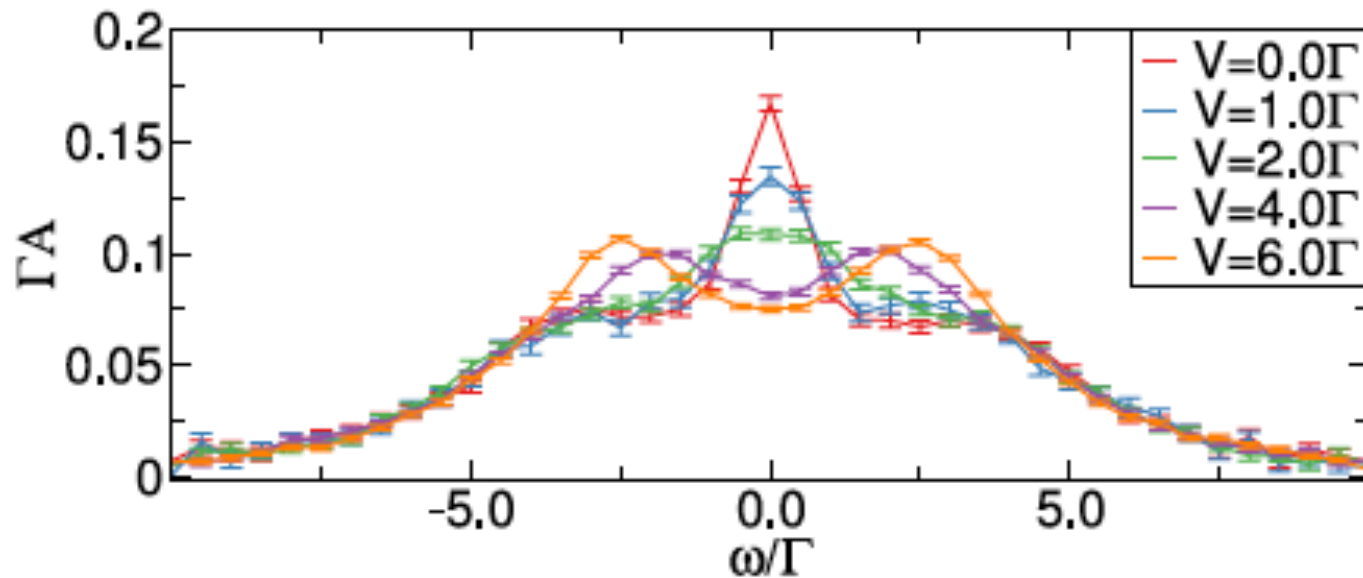
**Kondo effect: bind spin  
to electron at fermi  
level of lead.**

**Out of equilibrium—  
which lead do you  
choose?**

**does the Kondo  
resonance split?**

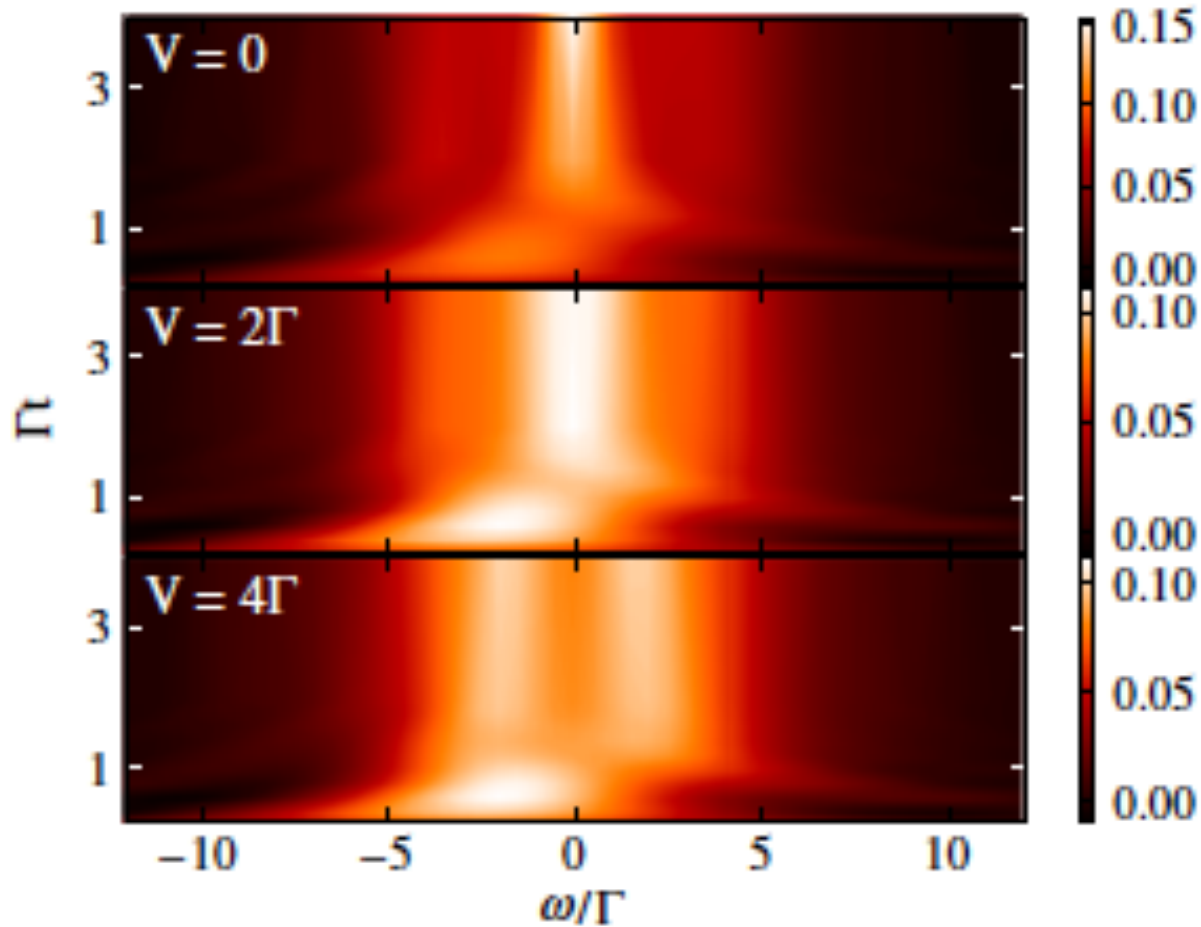


# Steady state nonequilibrium spectral function: Kondo resonance splits (!)



**Many people had discussed this; our result provides converged numerics substantiating the effect**

# How does it happen in time



# Equation of motion (R. Hartle)

$$i \frac{d\sigma}{dt} = [\mathbf{H}_{\text{impurity}}, \sigma] - i \int_0^t dt_1 \kappa(t_1) \sigma(t - t_1)$$

**Density matrix (1 time operator obeys an equation involving a kernel (connects 2 times))**

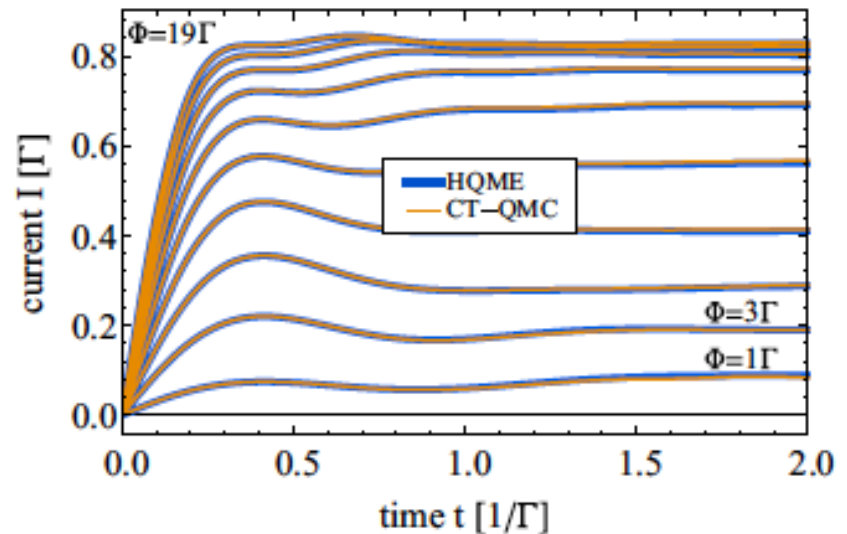
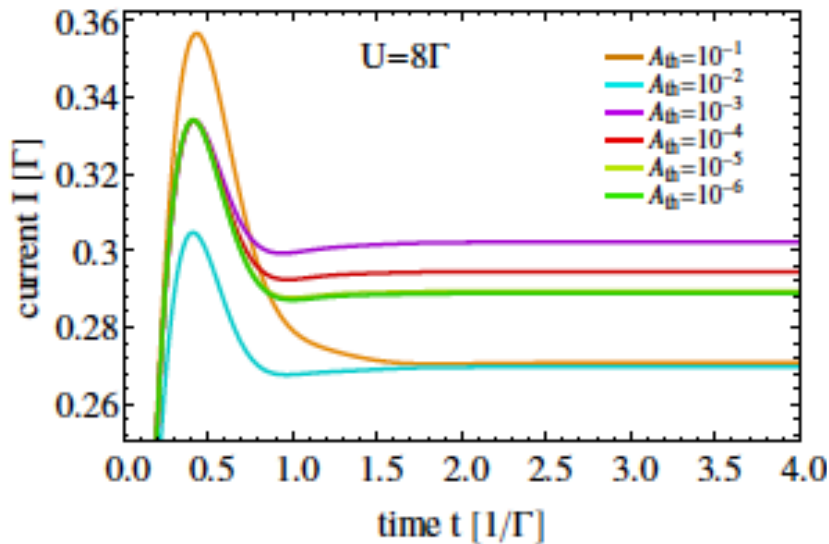
**Kernel obeys an equation of motion involving a 3 time operator...**

**Truncate hierarchy at some level=> closed system of equations. Control by increasing level of hierarchy until convergence achieved**



# Convergence and comparison

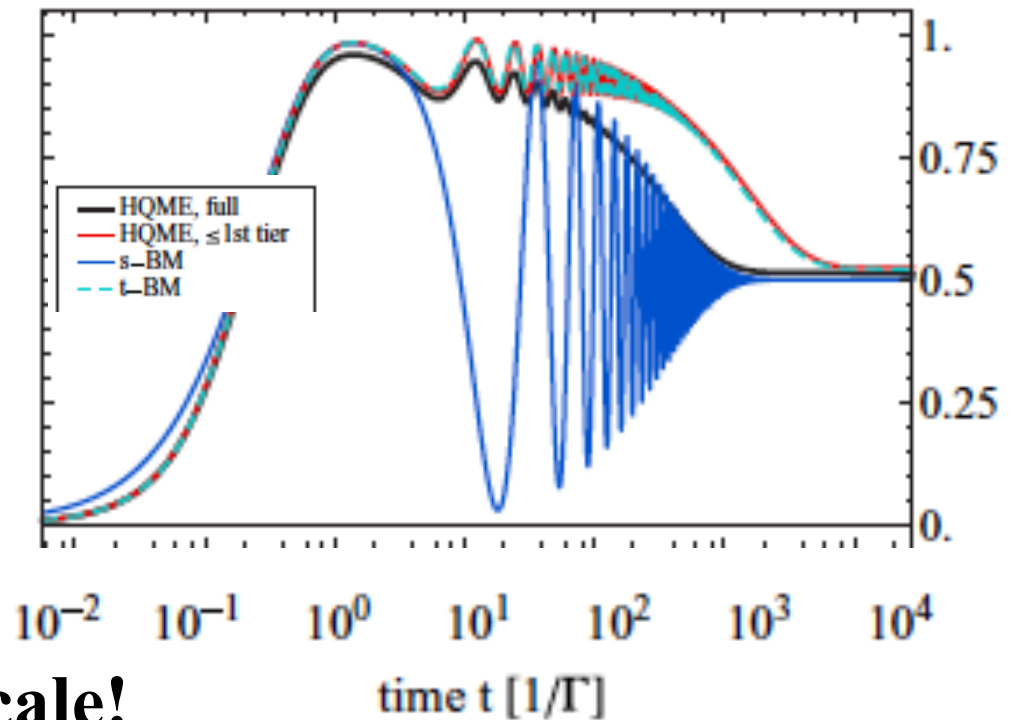
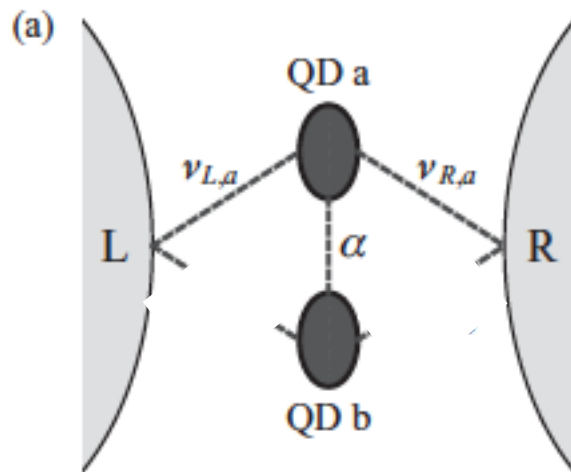
$$T = \frac{\Gamma}{5}$$



R. Hartle, G. Cohen, D. Reichman and AJM PRB 92 085430



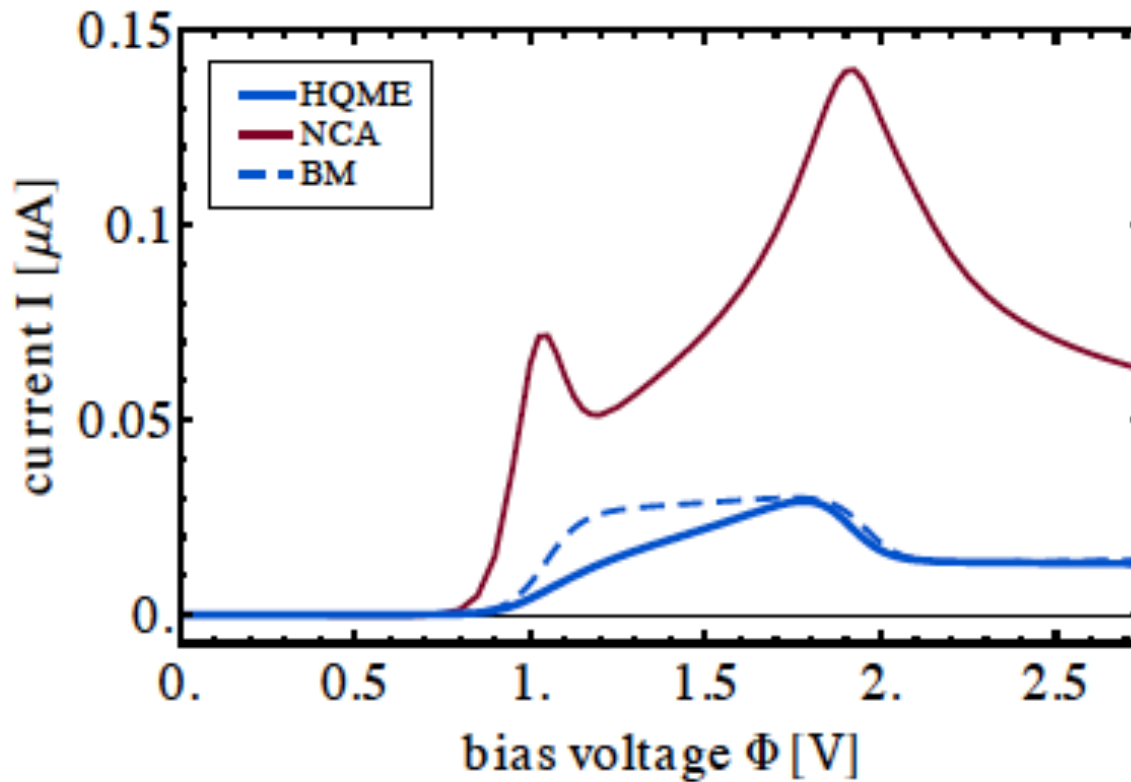
# Results: quantum dot with branch not connected to leads



Notice the time scale!

R. Hartle and A. Millis, Phys. Rev. B.90.245426

# Comparison to other methods



**R. Hartle**

# Very recent work

Profumo, Groth, Messio, Parcollet Wantal

## Key Points

- **Interaction expansion**
- **Impose unitarity (stochastic exploration includes diagram and its 'unitarity complement')**
- **Examine convergence of perturbation series**

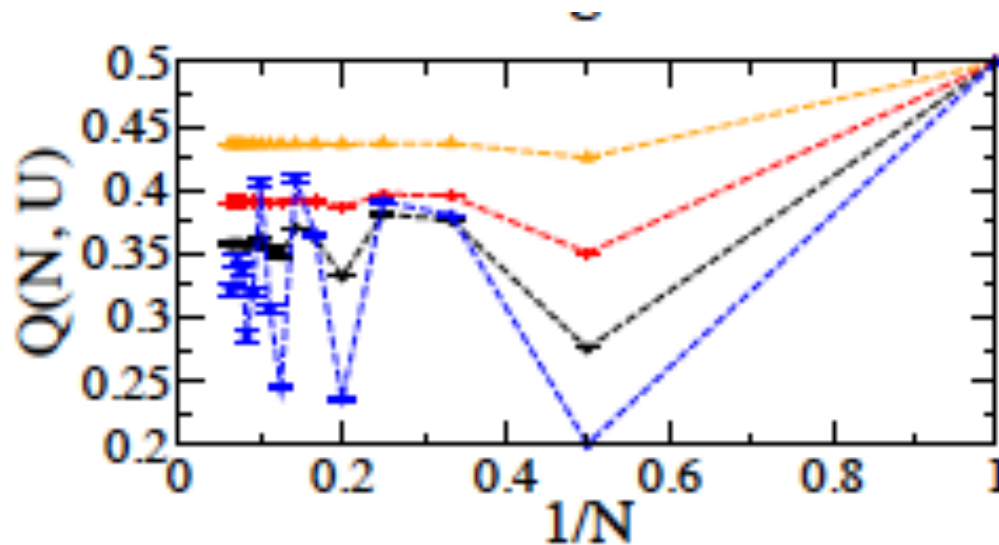


# Result:

## apparent FINITE radius of convergence in general case

Examine series for  
charge ( $Q$ ) term by term

$$Q(N, U) = \sum_{n=0}^{N-1} Q_n U^n$$



**U=0.2**

**U=0.4**

**U=0.6**

**U=0.8**

# Summary:

**At least for simple models methods in place to get long time nonequilibrium response**

**Simple approximations: quantitatively and sometimes qualitatively wrong.**

**Convergence ultimately controlled by temperature—convergence properties of  $T=0$  series not yet clear.**

