#### Quantum Monte Carlo for Transition Metal Oxides

#### Lucas K. Wagner

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QMC in the Apuan Alps III

## In collaboration with Lubos Mitas (NCSU) and Jeff Grossman (UCB)

Lucas K. Wagner Quantum Monte Carlo for Transition Metal Oxides

- www.qwalk.org : open-source QMC code
- C++, nice, very extensible
- Long list of features
- www.nanohub.org : pays part of my salary
- Lots of useful tools and learning material, including QMC!

	🔿 🔿 🔿 🔯 QWalk Quantum Monte Carlo Tutorial
	<u>F</u> ile
	● Set up system → ② Run QMC → ③ Simulate
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- <b>3</b>	
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QMC!	
	Run QMC >



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OOO X QWalk Quantum Monte Carlo Tutorial	
Ele	
● Set up system → ② Run QMC → ③ Simulate	
Method: Variational Monte Carlo	•
Wave function: Slater times two-body Jastrow	•
Variational Monte Carlo	
Number of averaging blocks: 100	
Optimize wave function: 🔴 yes	-
Wave function optimization	
Sample points: 500	-
Continue It: 0	*
< Set up system	Simulate > /

	O O O X QWalk Quantum Monte Carlo Tutorial
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	● Set up system → ② Run QMC → ⑤ Simulate
<ul> <li>www.qwalk.org : open-source QMC code</li> <li>C++ nice very extensible</li> </ul>	Running simulation output to twobody.opt.o node 0 alive on lucas-wagners-computer-2.local System Wave function Pseudoptextial
	O configs read 500 configs randomly generated wfdata allocate
<ul> <li>Long list of features</li> </ul>	
<ul> <li>www.nanohub.org : pays part of my salary</li> <li>Lots of useful tools and learning material, including QMC!</li> </ul>	6% Optimizing wave function (percentage is worst-case) Abort

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#### In this talk

#### Goal

- Method to calculate the properties of transition metal (TM) materials.
- D-orbitals behave very differently from S and P-how?

#### References:

- JCP 126 034105 (2007)
- J. Phys: Condensed Matter topical review coming very soon

#### Methods

- DFT and DMC, mostly
- Small core (Ne) ECP on TM
- TZ basis set
- QWalk (www.qwalk.org) for all QMC calculations
- GAMESS and CRYSTAL for mean-field
- Will decribe newish methods as we go.

#### TMO molecules

- Two atom molecules: small, good for benchmarks
- TM-O bond is present from ferroelectrics to supernova remnants
- DFT and HF describe them poorly..

Want a scalable, accurate method on these materials.

#### Energetics: Binding energy of TiO



# Results depend on the nodes Hartree-Fock nodes are poor B3LYP nodes are good d-p hybridization is important

#### Energetics: Binding energy of TiO



Results depend on the nodes

B3LYP nodes are good

Hartree-Fock nodes are poor

d-p hybridization is important



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#### How's the density in QMC?



- B3LYP enhances hybridization over HF
- QMC(HF) also enhances hybridization
- QMC(B3LYP) enhances hybridization even more
- HF nodes limit hybridization in QMC

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#### Orbital dependence of the fixed-node approximation



#### **Binding Energies of TMO Molecules**



Geometry minimization

Non-energy properties

Conclusion

#### BaTiO<sub>3</sub>: Ferroelectric



#### BaTiO<sub>3</sub> challenges

- Ferroelectric effect driven by the Ti-O interaction which is very sensitive to the lattice constant
- LDA underestimates volume by 1%, suppresses polarization by 50%
- GGA overestimates volume more
- Distortions, etc are ok in DFT if the volume is set to experimental

Geometry minimization

Non-energy properties

Conclusion

#### BaTiO<sub>3</sub>: cohesive energy



- Orbitals matter. More d-p hybridization than Hartree-Fock.
- Lattice constant?



density versus Hartree-foch

#### Minimum Energy Geometry A Bayesian Approach

Idea: Use accurate (but noisy) QMC energies to find equilibrium geometry.

#### Theory

- Given data *D* and model *M*:  $P(M|D) = \frac{P(D|M)P(M)}{P(D)}$
- *P*(*M*): Prior distribution
- P(D): Normalization

• 
$$P(D|M) \propto \prod_i exp(\frac{-(M(x_i)-D(x_i))^2}{(2\sigma(x_i)_D^2)})$$

#### An example Standard fitting versus Bayesian



• 
$$M(x) = a + bx + cx^2$$

- $pdf(min) = \iiint P(M|D)\delta(min \frac{-b}{2c})da \ db \ dc$
- Standard fitting underestimates the uncertainty!

#### Other uses for Bayesian analysis

- Predicting best next point
- Model comparison
- What is the probability that *E*<sub>min</sub> of phase A is larger than *E*<sub>min</sub> of phase B?

#### TMO Molecules: Minimum Bond Lengths



#### BaTiO<sub>3</sub>: Cubic Volume



- Same method as used on TMO molecules
- 320 electrons, 960 dimensional integrals

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#### **Reptation Monte Carlo**



RMC walker on TiO

#### Algorithm sketch

- Need the pure distribution Φ<sub>0</sub>Φ<sub>0</sub>
- Walkers are paths:

$$s = \{X_0, X_1, \ldots, X_{n-1}, X_n\}$$

• Sample the path distribution  $\Psi_T(X_0)G(X_0, X_1, \tau) \dots G(X_{n-1}, X_n, \tau)\Psi_T(X_n)$ 

$$\operatorname{pdf}(X_0) = \operatorname{pdf}(X_n) = \Psi_T \Phi_0$$
  
 $\operatorname{pdf}(X_{\frac{n}{2}}) = \Phi_0^2$ 

#### Performance of Slater-Jastrow wave function



RMC mostly overestimates the dipole moment..why?

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#### Case study: TiO



- Determinant weights optimized in VMC
- Significant energy gain, change in dipole moment
- Close to CC number, but still higher than experiment.

#### TiO dipole moment in detail



- Seems closer, but quite far away
- PSP error  $\sim$  0.1 Debye..

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#### Conclusion

New Methods:

- First application of RMC to heavy atoms
- Bayesian fitting is versatile and correct

#### Performance on TMO's:

- Energetics, with a good trial function, are wonderful
- For dipole moments, it looks more challenging. More calculations would be interesting.
- Physics about correlation:
  - Enters heavily in the d-p hybridization of TMO's
  - Is fundamentally important: it affects the one-particle density significantly

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#### Thanks..

## Money from NSF GRF. Help from Lubos Mitas, Jeff Grossman, and many others. Computation from NCSA and NCSU PAMS cluster.