KINETIC MONTE CARLO SIMULATION OF OXYGEN AND CATION DIFFUSION IN YTTRIA-STABILIZED ZIRCONIA
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ABSTRACT
Yttria-stabilized zirconia (YSZ) is of interest to the aerospace community, notably for its application as a thermal barrier coating for turbine engine components. In such an application, diffusion of both oxygen ions and cations is of concern. Oxygen diffusion can lead to deterioration of a coated part, and often necessitates an environmental barrier coating. Cation diffusion in YSZ is much slower than oxygen diffusion. However, such diffusion is a mechanism by which creep takes place, potentially affecting the mechanical integrity and phase stability of the coating. In other applications, the high oxygen diffusivity of YSZ is useful, and makes the material of interest for use as a solid-state electrolyte in fuel cells.

The kinetic Monte Carlo (kMC) method offers a number of advantages compared with the more widely known molecular dynamics simulation method. In particular, kMC is much more efficient for the study of processes, such as diffusion, that involve infrequent events.

We describe the results of kinetic Monte Carlo computer simulations of oxygen and cation diffusion in YSZ. Using diffusive energy barriers from ab initio calculations and from the literature, we present results on the temperature dependence of oxygen and cation diffusivity, and on the dependence of the diffusivities on yttria concentration and oxygen sublattice vacancy concentration. We also present results of the effect on diffusivity of oxygen vacancies in the vicinity of the barrier cations that determine the oxygen diffusion energy barriers.
Kinetic Monte Carlo Simulation of Oxygen and Cation Diffusion in Yttria-Stabilized Zirconia.

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Motivation

Yttria-stabilized zirconia (YSZ) is of interest to the aerospace community, notably for its application as a thermal barrier coating for turbine engine components. In such an application, diffusion of both oxygen ions and cations is of concern. Oxygen diffusion can lead to deterioration of a coated part, and often necessitates an additional anti-oxidation coating. On the other hand, the high oxygen diffusivity of YSZ makes the material of interest for use as a solid-state electrolyte in fuel cells. Cation diffusion in YSZ is much slower than oxygen diffusion. However, such diffusion is a mechanism by which creep takes place, potentially affecting mechanical integrity and phase stability.
Currently, molecular dynamics (MD) is the method of choice when examining the dynamical behavior of many-atom systems. MD produces detailed trajectories of atoms, but is typically limited to time scales on the order of nanoseconds. When the phenomenon under study involves so-called "infrequent events," MD may be very inefficient. A diffusive hop (the mechanism behind both oxygen ion and cation diffusion) is such an event. kMC is a simulation method designed to deal with infrequent-event systems. It averages out the system's behavior during "uninteresting" times and concentrates on the events of interest, and is typically much faster than MD for such systems. It requires a knowledge of all the "interesting" events accessible to the system. It does not provide detailed atomic trajectories.

Why Kinetic Monte Carlo?
We describe the results of kinetic Monte Carlo computer simulations of oxygen and cation diffusion in YSZ. Using diffusive energy barriers from ab initio calculations and from the literature, we present results on the temperature dependence of oxygen and cation diffusivity, and on the dependence of the oxygen diffusivity on Y concentration. We also present preliminary results of the effect on diffusivity of oxygen vacancy clustering near Y ions.
kMC, as applied to diffusion

The sole events of interest are diffusive hops among vacancy sites on the oxygen or cation sublattices. Because the vibrational frequency is much larger than the average frequency of hops, the system loses its memory of the previous event (here, which of a vacancy’s neighbors were involved in the previous hop). Therefore, the events can be considered as independent.

In such cases, the probability per unit time that a vacancy will undergo a diffusive hop is constant, and the probability distribution for the first hop is given by

\[ p(t) = \nu_{tot} \exp(-\nu_{tot} t) \]

where \( \nu_{tot} \) is the aggregate rate constant for all hops accessible to the vacancy. Because all events are independent, the overall hopping rate is the sum of the individual rates for each accessible hop.

In diffusive hopping, the rates depend on the energy barriers:

\[ \nu_{AB} = \nu^0 \exp\left(-\frac{E_{AB}}{k_B T}\right) \]

in which \( \nu_{AB} \) and \( E_{AB} \) are the hopping rate and migration barrier energy for a hop between oxygen or cation sites A and B respectively, and \( \nu^0 \) is the frequency factor.

The hopping probability is computed from the hopping rate:

\[ P_{AB} = \frac{\nu_{AB}}{\Gamma} \]

where \( \Gamma \) is the sum of all hopping rates.
A computational cell is constructed with the appropriate numbers of Y cations and O vacancies distributed randomly, consistent with charge neutrality. All events accessible to the system are identified and the corresponding event probabilities are computed and collected in an event catalog.

Iterative kMC procedure:

An event is chosen at random and executed.

The simulation clock is advanced by a time step \( \Delta t = -\frac{\ln(R)}{\Gamma} \)

where \( R \) is a random number greater than zero and less than or equal to unity.

The event probabilities and rates are modified to reflect the new state of the system, and are included in the modified catalog.

When the simulation has run long enough to accumulate statistically useful information, the mean square displacement, averaged over all vacancies, is computed. The vacancy diffusivity \( D_\nu \) is obtained from the mean square hopping distance using the Einstein relation

\[
< R^2 > = 6D_\nu t
\]

and the ionic diffusivity \( D_i \) is obtained by balancing the number of vacancy and ion hops:

\[
D_i = \frac{C_{iv}}{1-C_{iv}} D_\nu
\]

where \( C_{iv} \) is the concentration of vacancies on the sublattice of the hopping ion.
Oxygen diffusivity in YSZ

Oxygen diffusivity of YSZ over the temperature range of interest is typically in the range of $10^{-6} - 10^{-7}$ cm$^2$/sec.

Diffusivity increases with increasing temperature.

Diffusivity increases with increasing Y concentration at low concentrations, and reaches a maximum at 8-12 mol percent Y$_2$O$_3$.

Results from experiment

Oishi and Ando find oxygen diffusivities of $0.5-3.0 \times 10^{-6}$ cm$^2$/sec over a temperature range of 1373K-2073K.

Strickler and Carlson find diffusivities in the range of $0.4-4.6 \times 10^{-6}$ cm$^2$/sec, and observe a maximum in the diffusivity as a function of concentration. They find that the maximum occurs at slightly higher concentrations at higher temperatures.

Results from simulation

Khan et al., produce diffusivities of $1.9 \times 10^{-7}$ to $3.0 \times 10^{-6}$ cm$^2$/sec over the temperature range 873K-2073K.

Krishnamurthy et al., produce diffusivities of $0.1-7.0 \times 10^{-6}$ cm$^2$/sec over a temperature range of 1000-2200K.


Barrier energies are assumed to depend only on the two barrier cations. The possible barrier pairs are Zr-Zr, Zr-Y and Y-Y.

Diffusion path is to the nearest neighbor on oxygen sublattice (100 direction). Each site on the oxygen sublattice has four cation neighbors that form a tetragon, and hopping occurs across tetragonal edges, with the hopping oxygen ion passing between two barrier cations.

MD simulations have yielded activation energies of 0.37 eV (Khan) and 0.2-0.8 eV (Li and Hafskjold). A tracer diffusion study finds a value of 0.44 eV, while results from bulk conductivity and ac impedance spectroscopy give values of 0.79-1.12 eV.

Energy barriers computed from ab initio Car-Parinello MD by Krishnamurthy et al. are shown below, along with values used in this work, obtained using the Abinit plane wave pseudopotential code with pseudopotentials from the Fritz-Haber Institute. Note that the ordering of the barrier energies is Zr-Zr, Zr-Y and Y-Y.

### Ab Initio Oxygen Diffusion Energy Barriers (Energies in eV)

<table>
<thead>
<tr>
<th>Authors</th>
<th>Method</th>
<th>Zr-Zr</th>
<th>Zr-Y</th>
<th>Y-Y</th>
</tr>
</thead>
<tbody>
<tr>
<td>Krishnamurthy, Yoon, Srolovitz and Car</td>
<td>Car-Parinello MD</td>
<td>0.58</td>
<td>1.29</td>
<td>1.86</td>
</tr>
<tr>
<td>Krishnamurthy, Srolovitz, Kudin and Car</td>
<td>Car-Parinello MD</td>
<td>0.473</td>
<td>1.314</td>
<td>2.017</td>
</tr>
<tr>
<td>This work</td>
<td>DFT</td>
<td>0.706</td>
<td>1.214</td>
<td>1.941</td>
</tr>
</tbody>
</table>
This trend has been postulated to be the result of a competition between two effects. 

1. As Y concentration increases, the number of oxygen vacancies increases so as to maintain electrical neutrality. Increasing the available vacancies increases the diffusivity. 

2. As Y concentration increases, the number of relatively high-energy Zr-Y and Y-Y barriers increases, inhibiting diffusion.

kMC diffusivities as a function of Yttria concentration are shown below. The absolute values of the diffusivity are in general agreement with experiment and with other simulations. Notably, the trend is consistent with experiment, and the maxima are in approximately the right places, and the location of the maximum increases with increasing Y concentration, as observed experimentally.
Temperature dependence of the oxygen diffusivity for a number of Yttria concentrations is shown below. Activation energies range from 0.25eV to 0.46eV, in good agreement with experiment.

The activation energies increase with increasing Yttria concentration. This is consistent with the larger numbers of high energy Zr-Y and Y-Y barriers present at higher Yttria concentrations.
There is some indication that oxygen vacancies may preferentially occupy either yttrium or zirconium nearest neighbor sites. If so, this may affect the barrier energies. We have computed the change in barrier energy for two cases.

1. A yttrium ion is a nearest neighbor to a hopping oxygen ion.
2. An oxygen vacancy is a nearest neighbor to a yttrium barrier ion.

Barrier energies with preferential O vacancy-Y ion clustering (energies in eV)

<table>
<thead>
<tr>
<th></th>
<th>Zr-Zr</th>
<th>Zr-Y</th>
<th>Y-Y</th>
</tr>
</thead>
<tbody>
<tr>
<td>Original</td>
<td>0.706</td>
<td>1.214</td>
<td>1.86</td>
</tr>
<tr>
<td>Y adjacent to hopping O</td>
<td>0.691</td>
<td>1.140</td>
<td>1.941</td>
</tr>
<tr>
<td>O vacancy adjacent to Y barrier ion</td>
<td>1.0006</td>
<td>1.64</td>
<td></td>
</tr>
</tbody>
</table>
There appears to be only a small effect on diffusivity at large Y concentrations, but additional configurations are currently being investigated.
Cation diffusion

Cation diffusion is treated in a similar way, except that the diffusion path and energetics are different. Initial ab initio calculations, along with MD results from the literature, suggest that nearest neighbor hops in the (110) direction are energetically favorable compared with longer (100) hops.

The barrier of oxygen ions consists of a single pair.

Cation hopping path. Oxygen ions are red, cations grey.
Ab initio calculations to date yield barrier energies that are somewhat too large. A more detailed ab initio reaction path calculation may resolve the issue.

Experimental values of the hopping enthalpies, and the ordering of the Zr and Y enthalpies, are not consistent.

We have chosen barrier energies of 3.7 and 3.62 for Y and Zr migration, respectively. These values have been chosen to produce diffusivities within the range of experimental values at 2000K. Note that the difference in barrier energies for Zr and Y hops is small.

<table>
<thead>
<tr>
<th>Author</th>
<th>Temperature Range, C</th>
<th>Value, eV</th>
</tr>
</thead>
<tbody>
<tr>
<td>Solmon</td>
<td>1300-1700</td>
<td>4.8-4.95</td>
</tr>
<tr>
<td>Gomez-Garcia</td>
<td>above 1500</td>
<td>5.5-6.0</td>
</tr>
<tr>
<td>Chien and Heuer</td>
<td>1100-1300</td>
<td>5.3</td>
</tr>
<tr>
<td>Dimos and Kohlstedt</td>
<td>1400-1600</td>
<td>5.85</td>
</tr>
<tr>
<td>Kilo</td>
<td>1125-1460</td>
<td>4.4-4.8</td>
</tr>
<tr>
<td>Mackrodt</td>
<td></td>
<td>2-7eV (migration energies)</td>
</tr>
<tr>
<td>This work</td>
<td></td>
<td>3.7 (Y), 3.62 (Zr)</td>
</tr>
</tbody>
</table>

Increasing the Y concentration increases the oxygen vacancy concentration, which increases the probability that a vacancy will exist in the barrier oxygen pair. Ab initio calculations suggest that such vacancies will reduce the barrier energy, and increase the diffusivity.

Cation diffusivity is expected to increase with cation vacancy concentration, but the number of such vacancies is small.

Because the barrier energies for Zr and Y hopping are not very different, the direct effect of increasing the Y concentration is expected to be small.

Increasing the Y concentration increases the oxygen vacancy concentration, which increases the probability that a vacancy will exist in the barrier oxygen pair. Ab initio calculations suggest that such vacancies will reduce the barrier energy, and increase the diffusivity.

Results from experiment and simulation are not conclusive, but only a weak concentration dependence is typically observed.
The vacancy concentration on the cation sublattice is much smaller than on the oxygen sublattice. We consider cation vacancy concentrations of one percent or smaller.

Diffusivity versus temperature for our results and results from the literature are shown at right. The slope of the line from our kMC calculations is less than that of the experimental results shown, although it differs from the results of Chien et al. by less than ten percent. Other kMC simulation results (not shown) using larger barrier energies show a slope more consistent with other experimental results. The reasonable agreement between simulation and experiment of the slopes of the ln(D) versus 1/T suggests that the kMC simulations capture the fundamentals of the diffusion process.
Conclusions and Outlook

kMC is capable of producing accurate simulations of "infrequent-event" phenomena, and provides insight into dynamical behavior without detailed atomic trajectories.

Oxygen diffusivities from kMC simulations using ab initio barrier energies are in reasonable agreement with experiment and other theoretical work.

There are small differences in the barrier energies depending on the cation species adjacent to the hopping oxygen ion or the barrier cations. Therefore it may be problematic to assume that oxygen vacancies and dopant cations are randomly distributed within the model lattice. It may be possible to generate more realistic distributions using a Metropolis Monte Carlo species exchange algorithm.

Ab initio barrier cation hopping energies for the assumed barrier complex are too large. Reaction path calculations may provide insight.

Using barrier energies derived from experiment produces cation diffusivities and temperature dependences that are in reasonable agreement with experiment.

We are currently extending our work to other dopants, and other TBC and EBC candidate materials.

Enlightening discussions with Beth Opila, Dongming Zhu, Nate Jacobson and Jim Smialek are gratefully acknowledged.
Possible additions to conclusion slide

KMC simulations can produce realistic diffusivities and temperature and concentration dependences.
kMC, briefly

All possible events of interest accessible to the system are identified, and the energetics computed. For each event, a probability, and the associated rate, are computed. All events and probabilities are organized into a catalog. Iteratively: An event is chosen at random from the catalog and executed. The simulation clock is advanced stochastically, consistent with the rates. The event catalog is updated to reflect the new accessible events and their probabilities.