

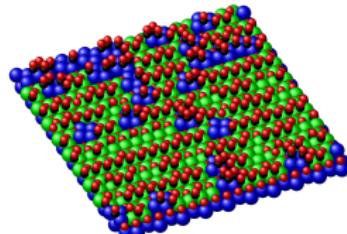
Multi-Lattice Approach to Kinetic Monte Carlo

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Jan 25, 2011



Outline

- introduction to DFT+kMC approach for heterogeneous catalysis
- multi-lattice kMC for CO oxidation on $\text{PdO}(\sqrt{5}\times\sqrt{5})\text{R}27/\text{Pd}(100)$ ¹

¹master thesis www.fhi-berlin.mpg.de/th/publications/Hoffmann_diploma.pdf

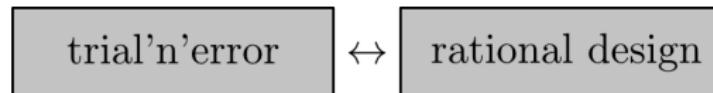
Motivation

- prediction of (model) catalysts performance from first principles



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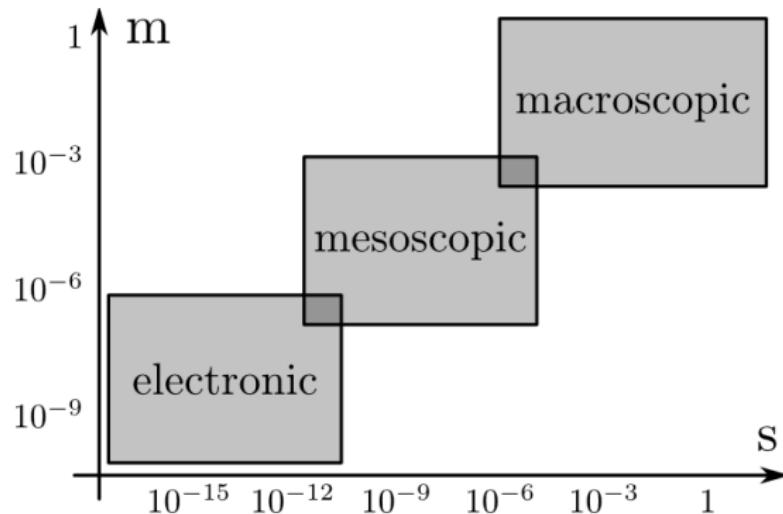


- development of multi-scale methods



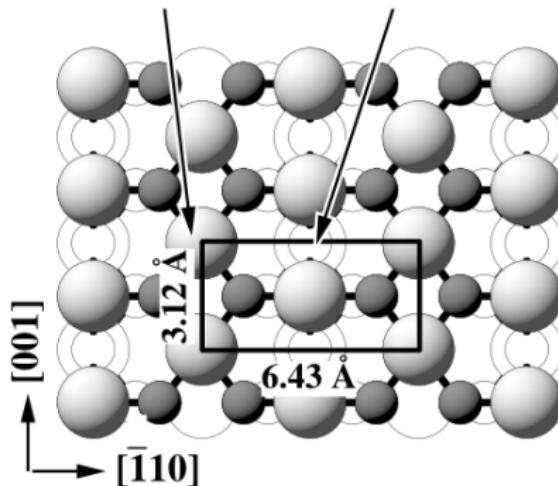
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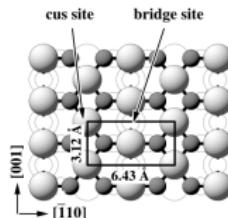




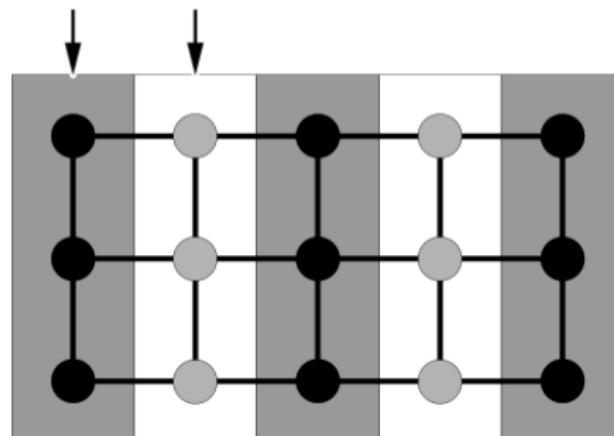
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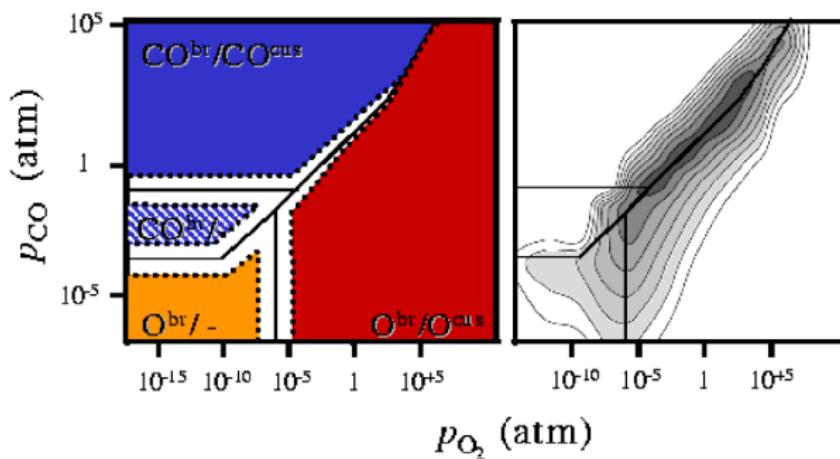
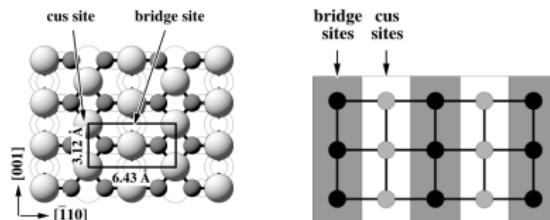
²Reuter et al (2005) in Handbook of Materials Modelling, Springer
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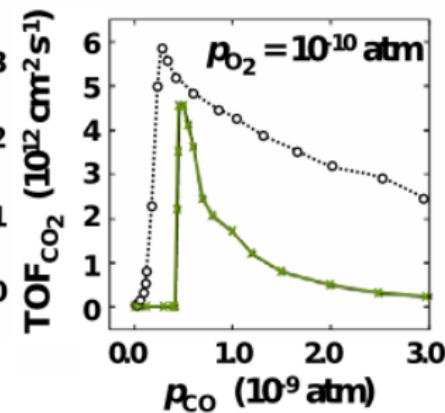
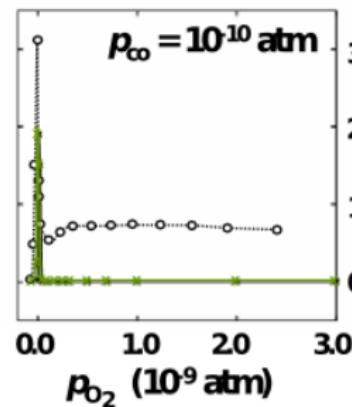
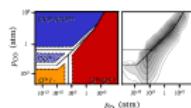
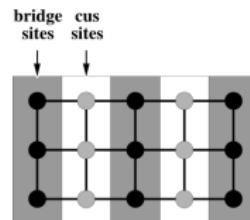
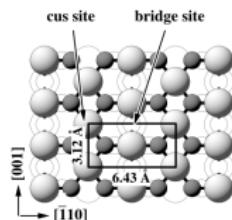
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What is kMC?

kinetic Monte Carlo (= dynamic Monte Carlo (DMC),
Bortz-Kalos-Lebowitz (BKL-Method)³, n -fold way, Gillespie⁴) all refer
to the same basic idea

³BKL (1975), J Comput Phys **17**, 10

⁴Gillespie (1976), J Comput Phys **22**, 403

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kinetic Monte Carlo (= dynamic Monte Carlo (DMC),
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to the same basic idea
generate state-to-state trajectory from initial configuration, catalog of
elementary steps, and rate constants.

$$\dot{p}_i = \sum_i k_{ij} p_j - k_{ji} p_i$$

k_{ij} : transition probability $i \rightarrow j$

Transition State Theory

$$k_{ij} = \frac{k_B T}{h} e^{-\Delta G / k_B T}$$

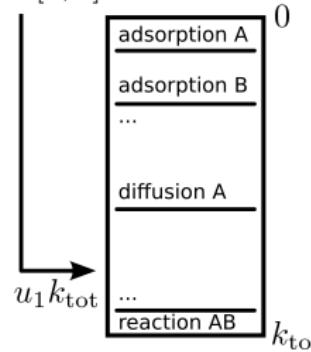
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More formally⁵

- pick next process based on random number,
weighted by rate constant

$$u_1 \in [0, 1]$$



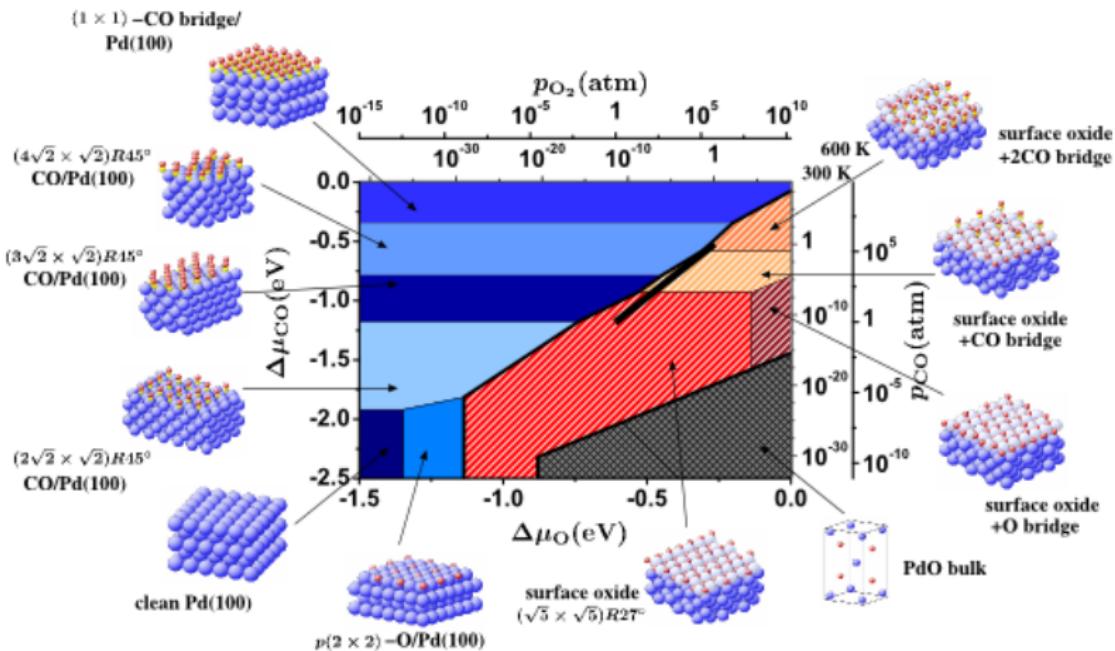
- increase time by

$$t \rightarrow t - \frac{\ln(u_2)}{k_{tot}} \quad u_2 \in (0, 1]$$

⁵Fichthorn, Weinberg, (1991), J Chem Phys **95**, 1090

Consider PdO/Pd(100)

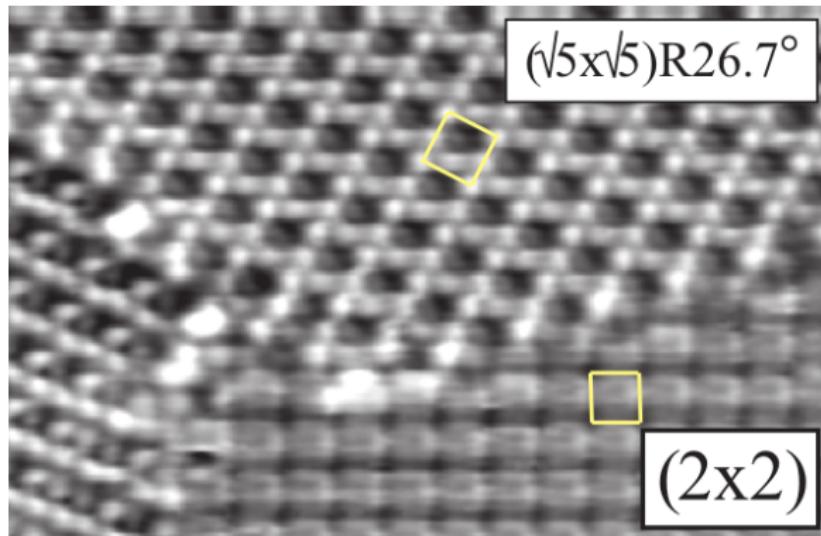
- non-trivial surface reconstruction under reactive conditions⁶



⁶Rogal et al (2007), PRL 98, 046101

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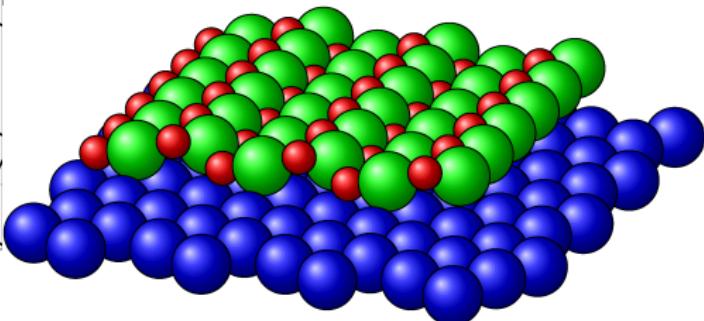
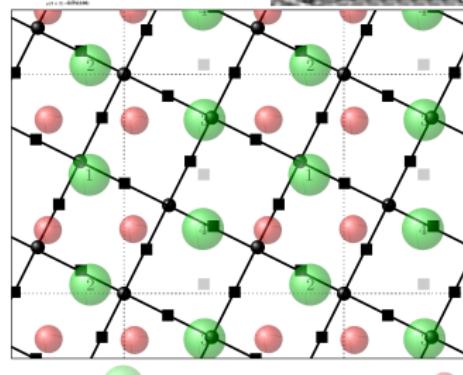
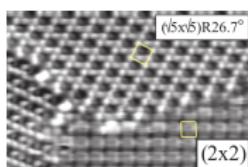
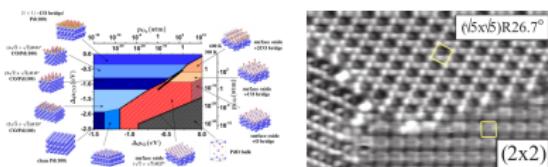
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⁶Lundgren (2006), J Phys Cond Matter **30**, R481

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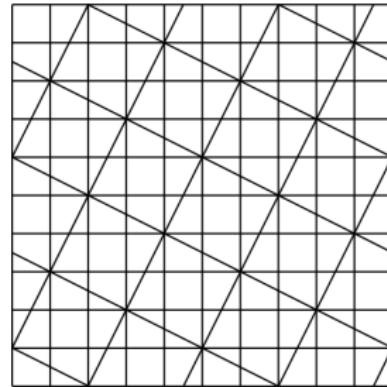
- non-trivial but *commensurable*⁶



⁶Todorova *et al* (2003), Surf Sci **541**, 101

Considerations for Multi-Lattice kMC

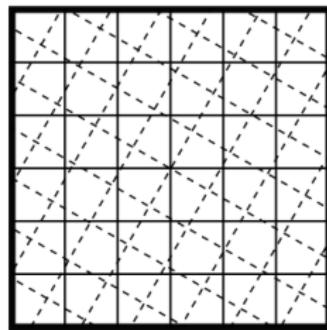
- lattices need to be pairwise commensurable (!)



Considerations for Multi-Lattice kMC

- lattices need to be pairwise commensurable
- integer coordinates desirable

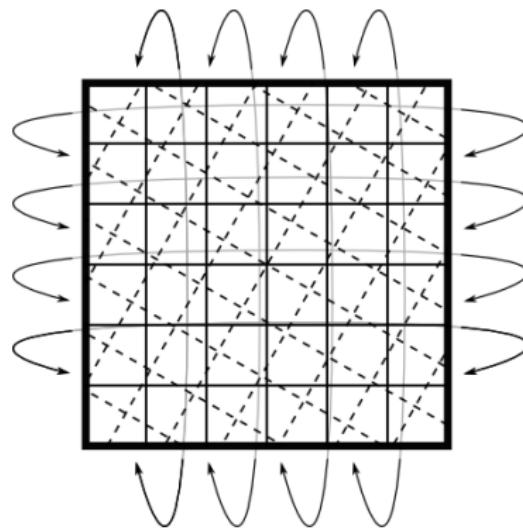
(N, M)



$(0, 0)$

Considerations for Multi-Lattice kMC

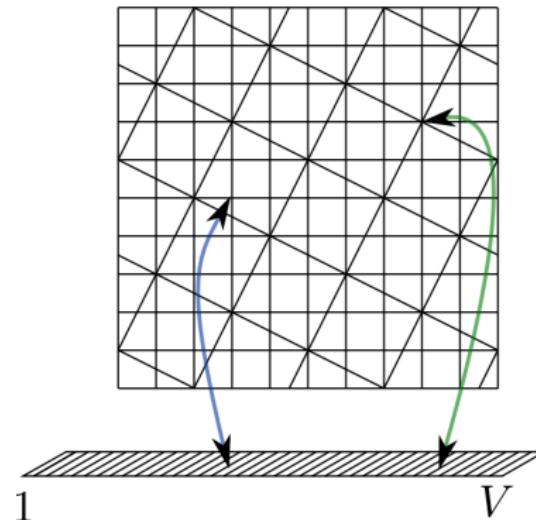
- lattices need to be pairwise commensurable
- integer coordinates desirable
- support periodic boundary conditions



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- lattices need to be pairwise commensurable
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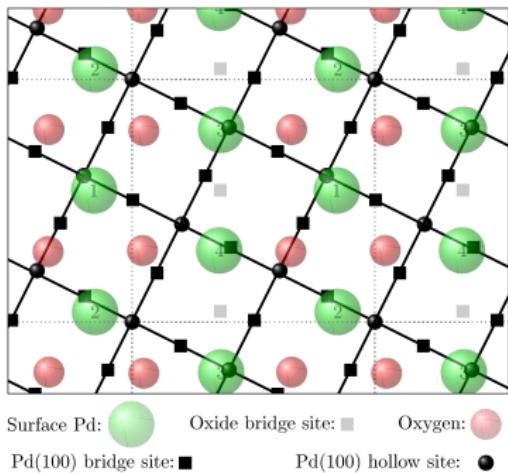
→ mapping approach



- only some sites are active
- describe processes in convenient coordinates

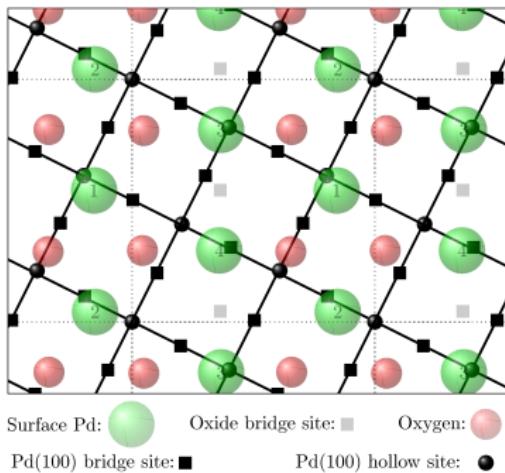
Reconstruction mechanism

■ geometrical considerations

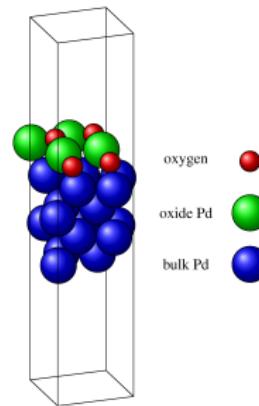


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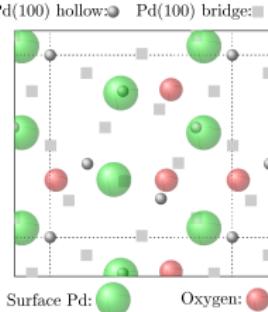
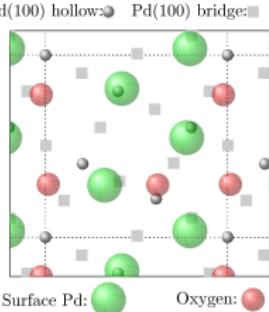
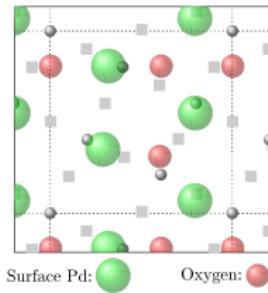
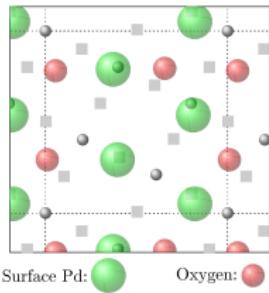


- surface slab geometry optimizations



DFT, VASP, PW-91, J. Jelic

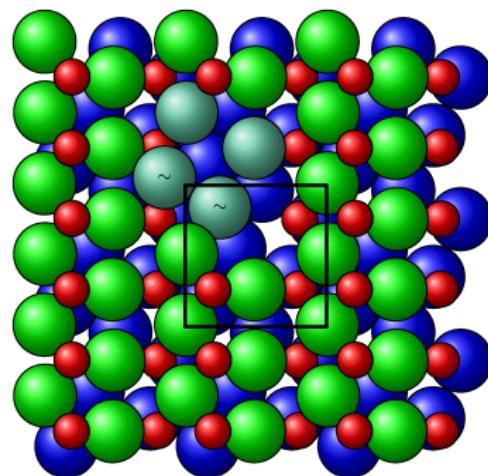
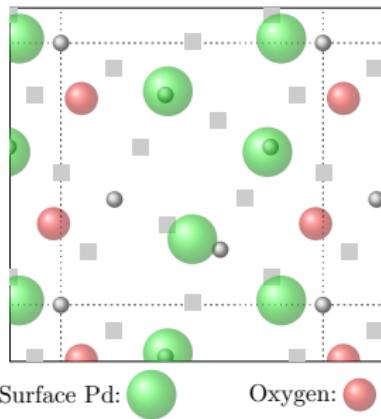
Remove one oxygen atom



→ no significant change

Remove two oxygen atoms

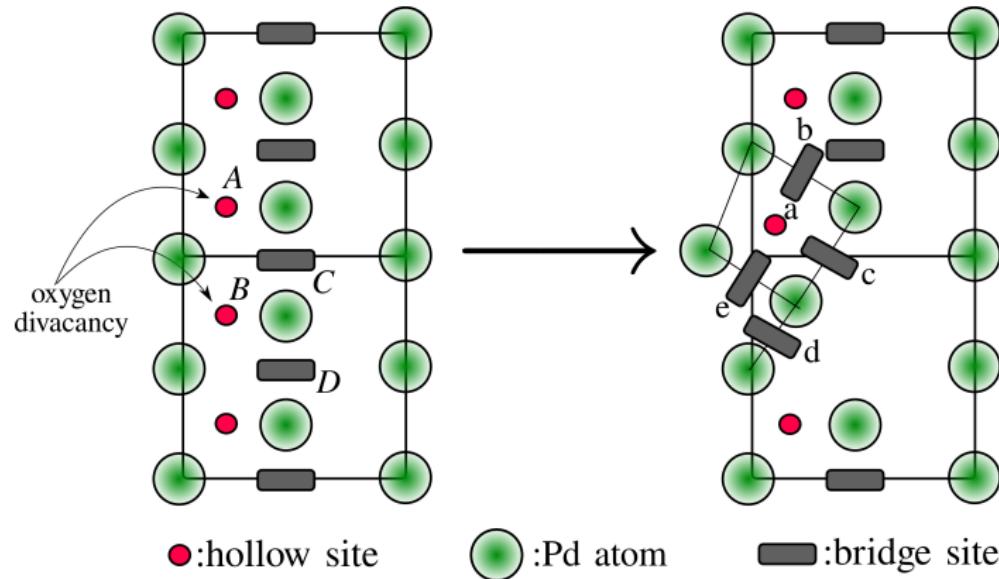
- structural changes occur



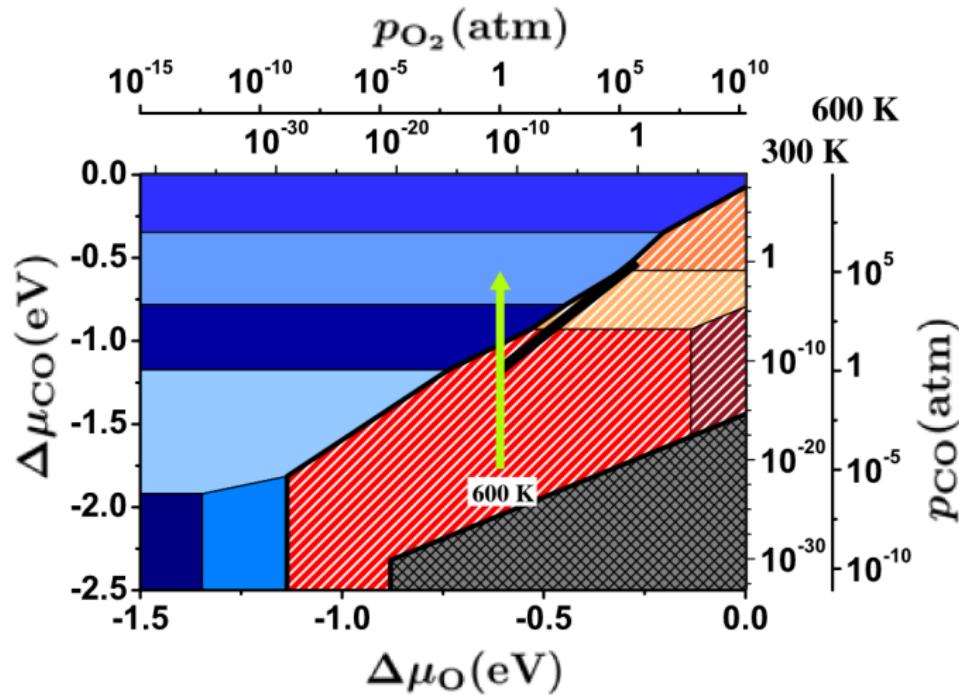
- Palladium atoms move to substrate hollow positions

Reconstruction rule

- map reconstruction back to discrete positions

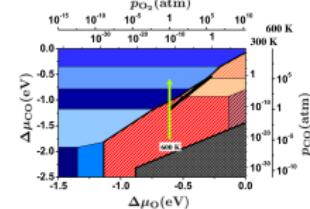
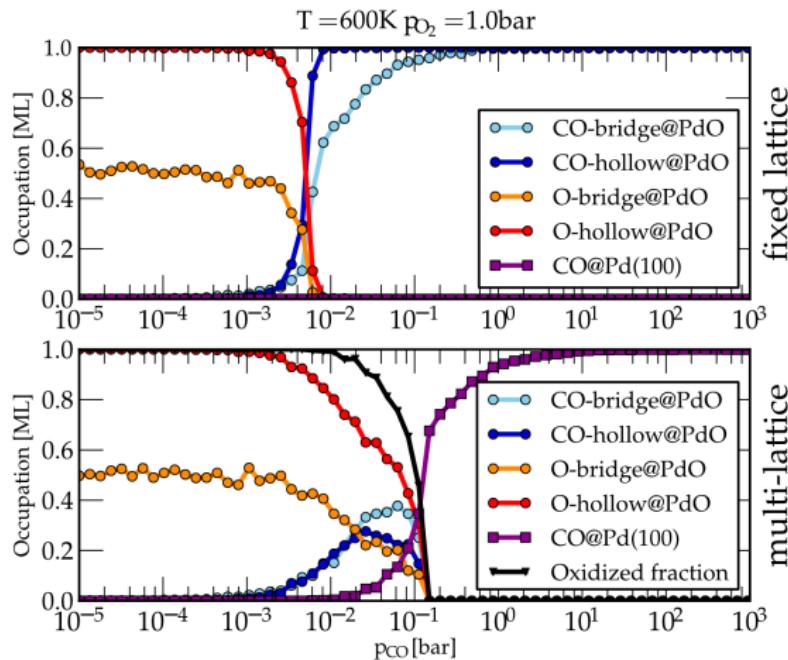


Refined oxide stability boundary⁷



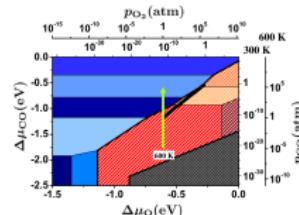
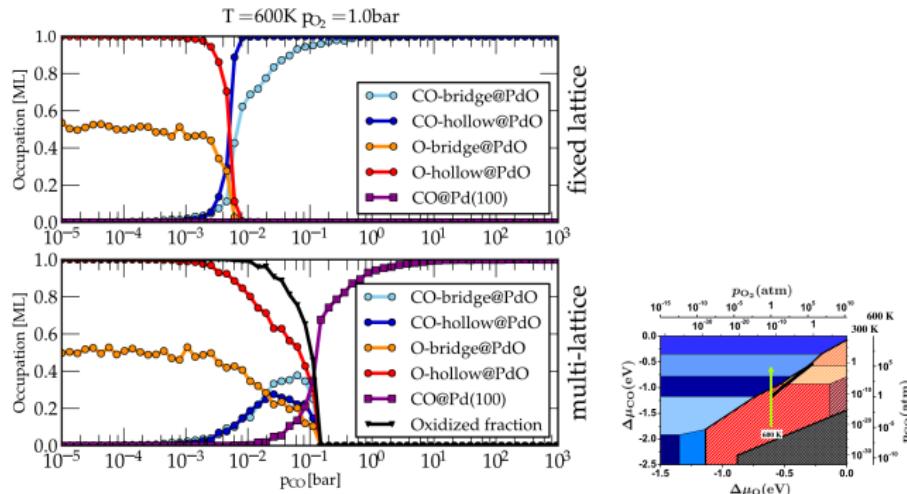
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Refined oxide stability boundary⁷



Present status

- uses only guessed rates constants for new processes not considered in the preceding 1p-kMC from Rogal *et al.*
- considers only the onset of oxide destruction

⁷Rogal *et al* (2008), PRB **77**, 155410

Summary

- DFT+kMC important tool to predict model catalyst behavior
- Multi-lattice kinetic Monte Carlo actually *works*
- Palladium surface oxide under reactive conditions

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- validation of assumed deconstruction mechanism through first-principles calculations
- detailed modelling beyond the deconstruction onset
- ultimately: fully first-principles based kMC simulation of sustained catalytic activity with full capability of oxide formation/reduction



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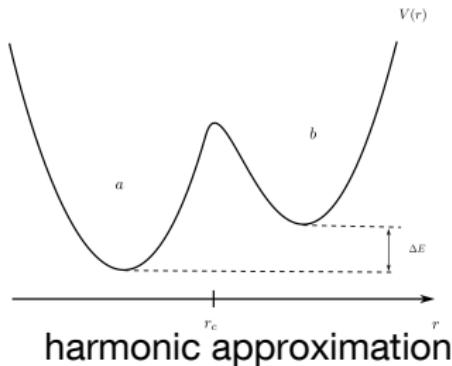
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Thank you for your attention



Transition State Theory



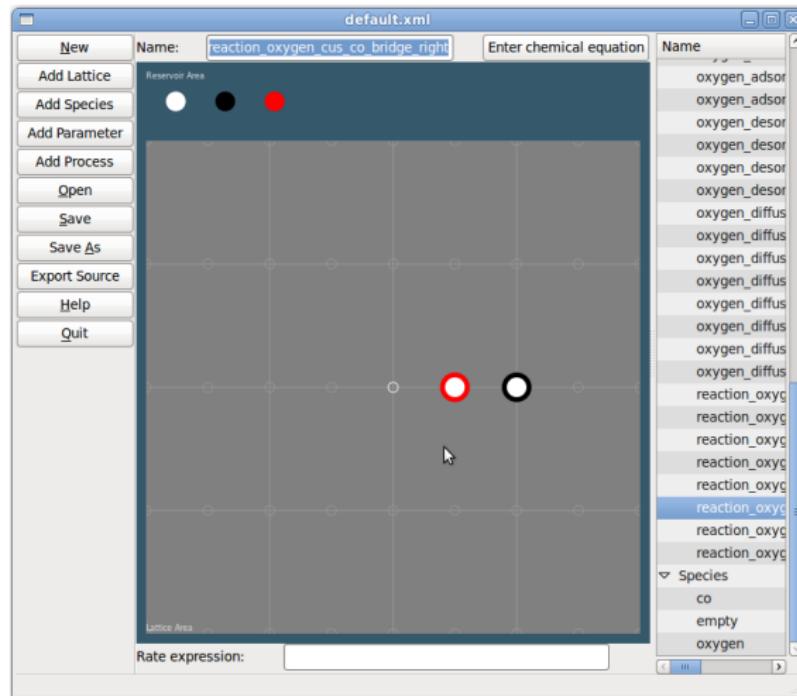
harmonic approximation

- flux-over-population

$$k_{\text{TST}} = \frac{\int dr dp \frac{p}{m} \delta(r - r_c) \Theta(p) e^{-\beta H}}{\int dr dp e^{-\beta H}}$$

$$k_{\text{TST}} = (\beta h)^{-1} e^{-\beta \Delta G}$$

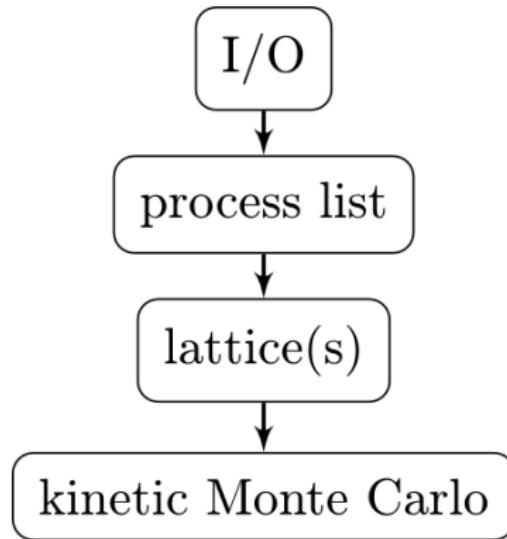
KMOS GUI⁸



⁸<http://mhoffman.github.com/kmos>

kMC modularization

- divide program parts based on degree of reusability



Oxide patching rule

- reversing the initial oxide destruction

