

# Combining molecular dynamics and on-the-fly kinetic Monte Carlo to investigate radiation damage in solids



Curtin University

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*Beyond Molecular Dynamics:  
Long Time Atomic-Scale Simulations*

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# Overview

- **Introduction into radiation damage.**
  - ▶ Motivation.
  - ▶ Time-scale problem.
  - ▶ Requirement for atomistic simulation.
  - ▶ General methodology.
- **Applications:**
  - ▶ Simulating self-irradiation effects of plutonium<sup>1-3</sup>.
    - Defect formation and migration in Ga-stabilised  $\delta$ -Pu.
  - ▶ The effect of structure on radiation damage<sup>4</sup>.
    - Comparison of radiation response of the rutile, brookite and anatase polymorphs of TiO<sub>2</sub>.

<sup>1</sup> M Robinson, S D Kenny, R Smith, M T Storr, E McGee. Nucl. Inst. Meth. B **267** 18 (2009)

<sup>2</sup> M Robinson, S D Kenny, R Smith, M T Storr. Nucl. Inst. Meth. B **269** 21 (2011)

<sup>2</sup> M Robinson, S D Kenny, R Smith, M T Storr. J. Nuc. Mat. **423** 1-3 (2012)

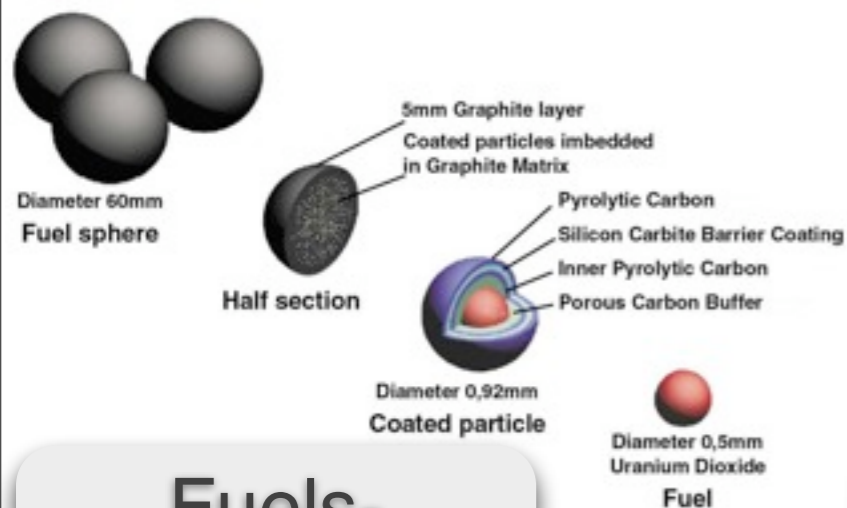
<sup>4</sup> M. Robinson, N. A. Marks, K. R. Whittle and G. R. Lumpkin Phys. Rev. B **85** 10 (2012)



# Introduction

- Materials for nuclear applications must all share one important property:

*“The ability to maintain functionality during exposure to extreme levels of irradiation”*



Fuels-  
TRISO/ $UO_2$



Waste forms -  
Synroc/ Oxide  
Ceramics



Reactor  
materials -  
ODS Steels



Fuel  
elements -  
Graphite

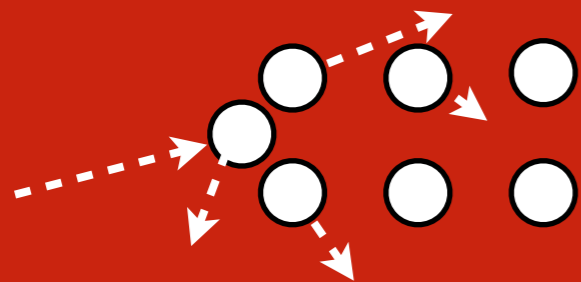
- Two key goals:
  - To develop new *‘nuclear materials’* for future reactors or waste forms.
  - To determine the life expectancy and failure mechanisms of materials currently in service.
- Requires an in-depth understanding of the **atomistic processes** that attribute to macroscopic changes in properties.

# Time scale problem

Radiation event

## Ballistic Phase

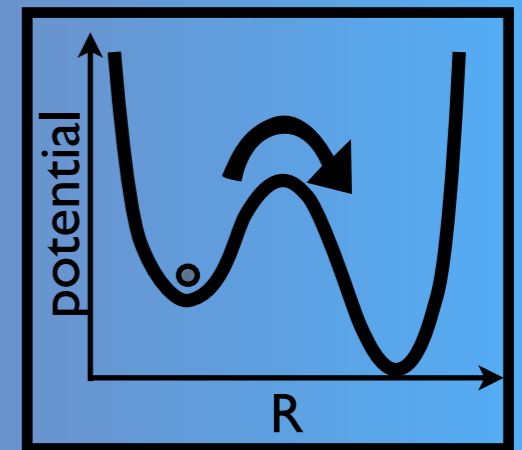
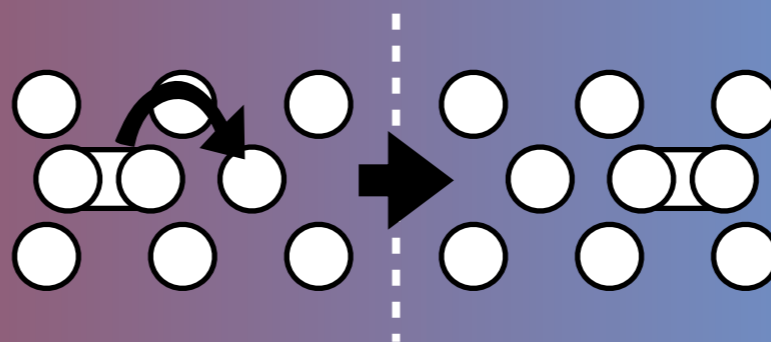
High Energy  $\sim$ keV  
Collision Cascade  
Thermal Spike



Time scales:  
up to  $\sim$ 20 ps

## Recovery Phase

Defect migration and recombination.  
Activated processes - “Rare Events”



Time scales:  
ns up to seconds, d/w/y

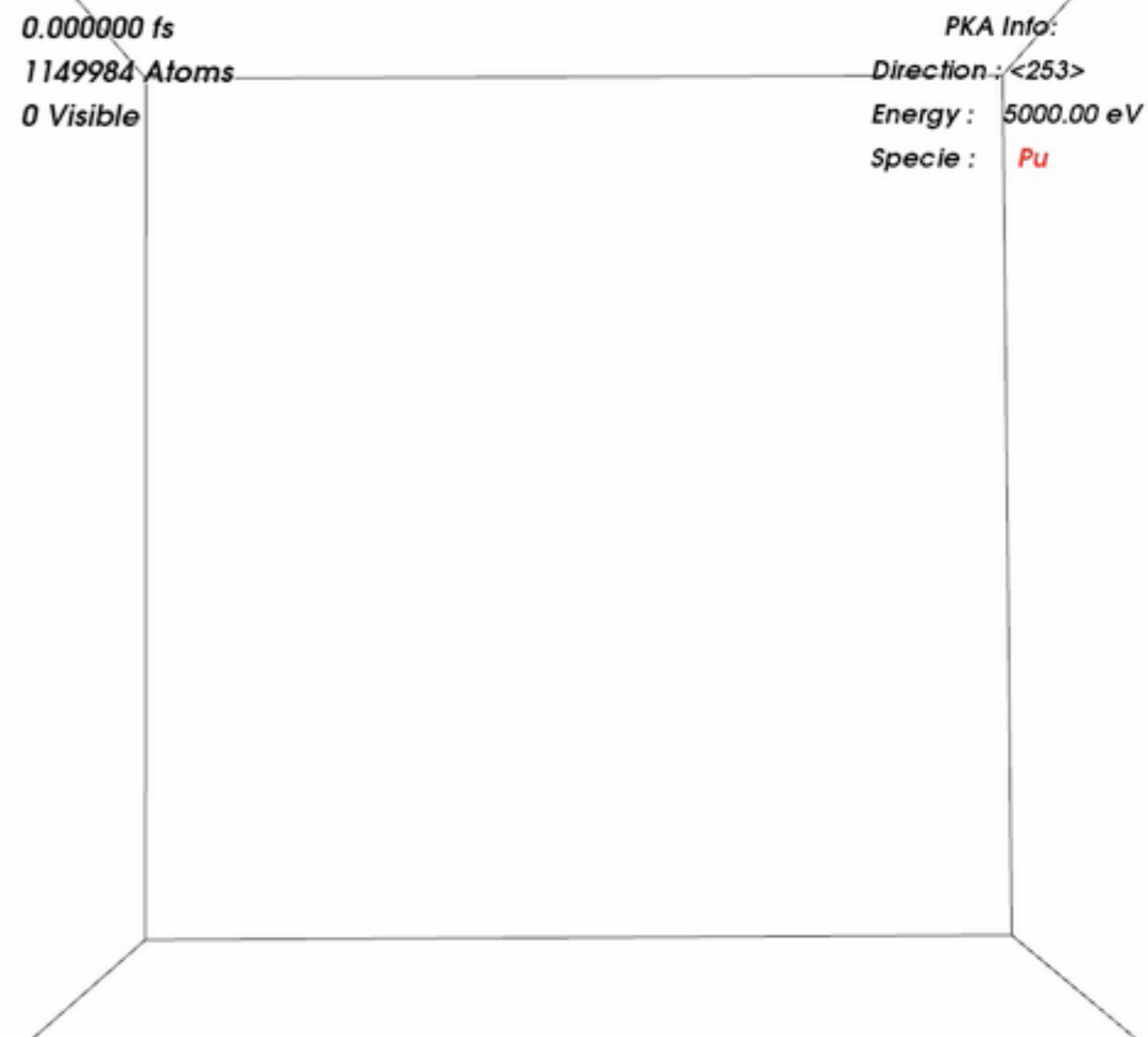


*but events may overlap...*



# Ballistic Phase

- Recoil event from a **Primary Knock-on Atom (PKA)**
- High energies, typically  $\sim$ keV (dependent on the simulated process)
- Requires dynamics
  - ▶ *Ab initio* methods unsuitable.
- Requires atomistic lattice effects
  - ▶ Phase field or continuum models inappropriate.
- Molecular dynamics is well suited to modelling the ballistic phase:
  - ▶ Time-scales:  $\sim$  $O$  (ns)
  - ▶ Length scale:  $\sim$  $O$  (nm)
  - ▶ Ensembles (thermo/barostats)



**Simulation:** 5 keV cascade in fcc Pu @ 300 K. 1.1M atoms 15 ps





# ***Molecular Dynamics***

- Molecular Dynamics (MD) is a powerful tool that can be used to investigate the ballistic phase at the atomic level response.
- In addition, MD has allowed in depth studies into all areas of radiation damage
  - ▶ Self-irradiation effects (decay).
  - ▶ Ion implantation (e.g SWIFT heavy ion).
  - ▶ Sputtering.
  - ▶ Defect aggregation at grain boundaries or interfaces.
  - ▶ Dislocation dynamics and diffusion.
  - ▶ Bubble formation.
- Serves as an alternative to analytical models of defect production (KP, NRT) or models based on the binary collision approximation (SRIM)

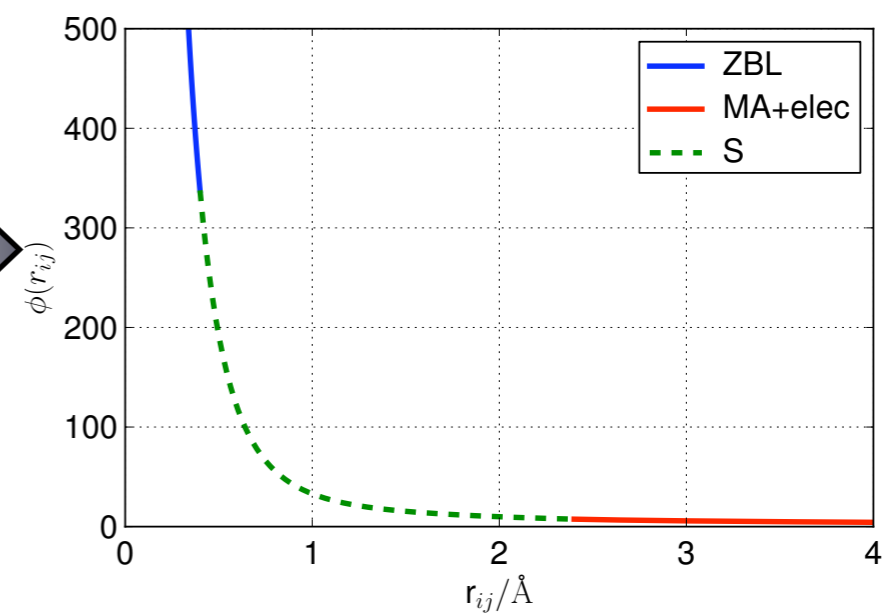
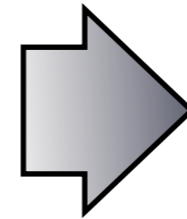
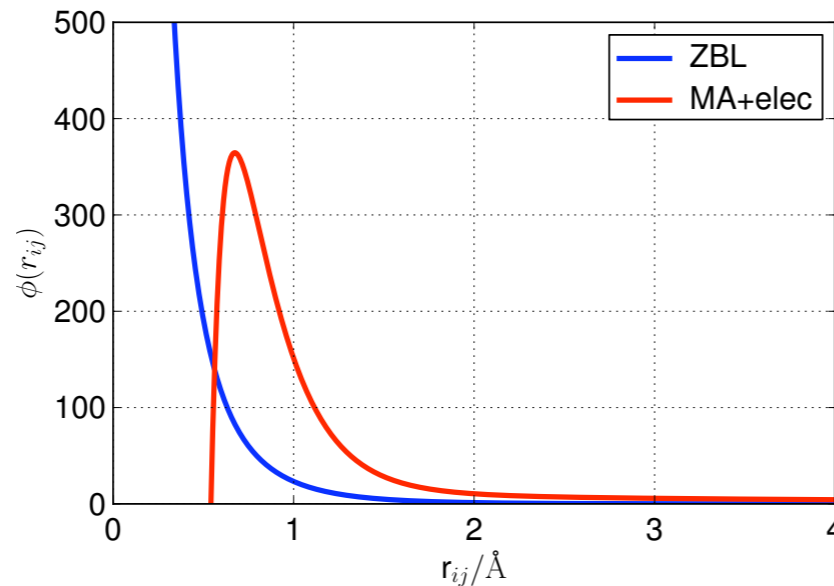


# Ballistic Phase

- Important requirements for modelling the ballistic phase using MD:

- ▶ **Interatomic potential**

- Must **depict nuclei-nuclei interactions** correctly - i.e. ZBL screened coulomb potential.



- ▶ **Variable time-step**

- Due to the **high atomic velocities**.

- ▶ **Sampling**

- Due to the **chaotic nature** of the atomic collisions, important to gain a high level of sampling of PKA **energies**, initial **directions** of impact, **thermal vibrations**, **atomic specie**.

- ▶ **Defect analysis**

- Vacancy/Interstitial (Frenkel pairs), Anti-sites, Dislocations, Schottky defects



# Recovery Phase

- Modelling the recovery phase is made significantly harder by the highly inhomogeneous nature of the residual lattice:
  - ▶ After the ballistic phase, the remaining lattice is potentially **highly disordered**.
    - Frenkel pairs, voids, dislocations.
  - ▶ The presence of **impurities** or **fission products**.
    - Bubble formation (H,He,Xe,Kr).
  - ▶ Nuclear materials and fuels are typically **complex** and **multi-component**
    - Structural vacancies, partial occupancy (i.e. disordered Pyrochlores/Fluorites ).
    - Interfaces or grain boundaries (ODS steels, fuel cladding).
- Removes the possibility of using on-lattice KMC due to the variation in local environment surrounding each defect.





# Recovery Phase

- The recovery phase itself can be broken down into :
  - ▶ Transitions where the **end state is known**.
    - **Examples:**
      - Simple vacancy/interstitial hops.
      - Direct recombination.
    - **Methods:**
      - Climbing image NEB<sup>1</sup>, String methods
  - ▶ Transitions where the **end state is unknown**
    - **Examples:**
      - Complex defect migration.
      - Long range recombination.
    - **Methods:**
      - Dimer<sup>2</sup>, ART<sup>3</sup>, RAT<sup>4</sup>
  - ▶ These techniques can also be used in on-the-fly KMC methods.
    - Migration and recombination pathways.

<sup>1</sup> G. Henkelman, B. P. Uberuaga, and H. Jónsson, The Journal of Chemical Physics **113**, 9901-9904 (2000).

<sup>2</sup> G. Henkelman and H. Jónsson, The Journal of Chemical Physics **111**, 7010-7022 (1999).

<sup>3</sup> G.T.Barkema and N Mouseau. Comp. Mat. Sci. **20** 3 (2001)

<sup>4</sup> L. J. Vernon, Modelling Growth of Rutile TiO<sub>2</sub>, Loughborough University, 2010.



# **Application 1**

***Simulating radiation damage in  
Ga-stabilised Pu.***



# *Application - Ga stabilised Pu*

- **Simulating radiation damage in Ga-stabilised  $\delta$ -Pu.**
  - ▶ Understanding the aging due to self-irradiation in fcc plutonium.
  - ▶ FCC plutonium is unstable at RT so is alloyed with a small percentage of Ga (up to ~12%)
- **Aim**
  - ▶ To study the radiation response of Ga-stabilised Pu.
    - Cascade simulations, displacement threshold energy calculations
  - ▶ To investigate the effect of Ga on defect diffusion.
    - Transitions barrier calculations and OTF-KMC of defect migration.



# Application - Ga stabilised Pu

- Methodology:
  - ▶ MD cascades
    - Modified Embedded Atom Method (**MEAM**) for PuGa<sup>1,2</sup> in **LBOMD**.
    - **0.2 - 10 keV** PKA energies.
    - 10 lattices equilibrated to **300K** for between 10-15 ps.
    - 12 PKA directions chosen from the FCC irreducible volume.
    - Thermal and periodic boundaries.
    - MD runs of 20 ps.
  - ▶ LTSD
    - Simple transitions, manual setup, MEP defined using CNEB.
    - Transition searches using Dimer/RAT methods
    - On-the-fly KMC - Dimer/RAT followed by CNEB

<sup>1</sup> M. I. Baskes, Physical Review B **62**, 15532-15537 (2000).

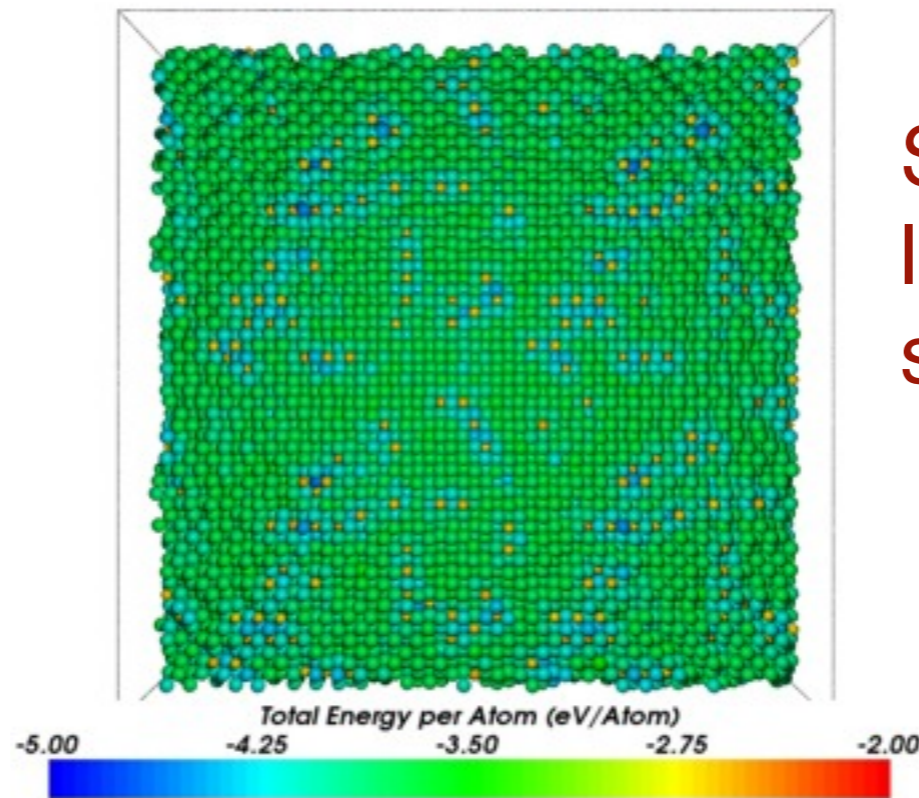
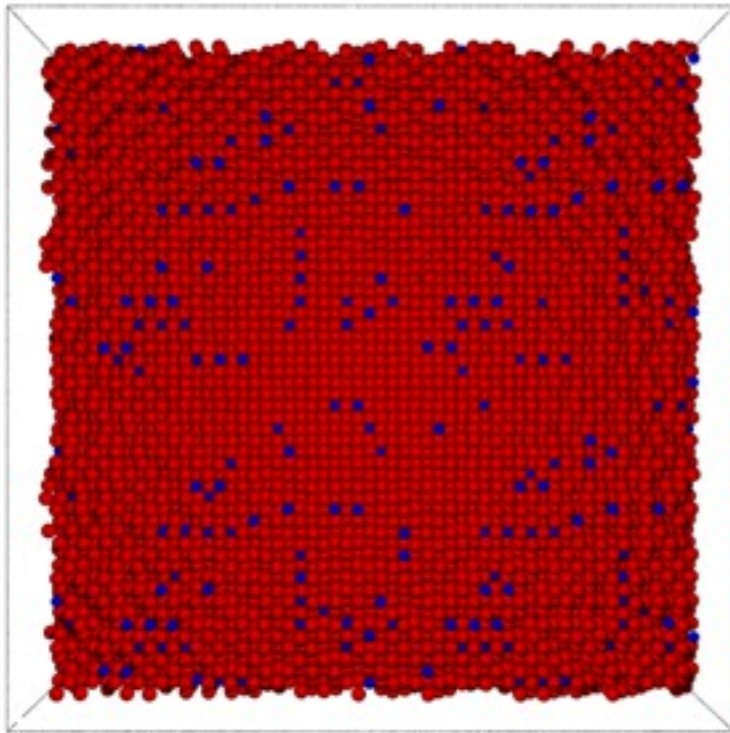
<sup>2</sup> M. I. Baskes, K. Muralidharan, M. Stan, S. M. Valone, and F. J. Cherne, JOM Journal of the Minerals, Metals and Materials Society **55**, 41-50 (2003).



# Application - Ga stabilised Pu

- **Lattice Structure**

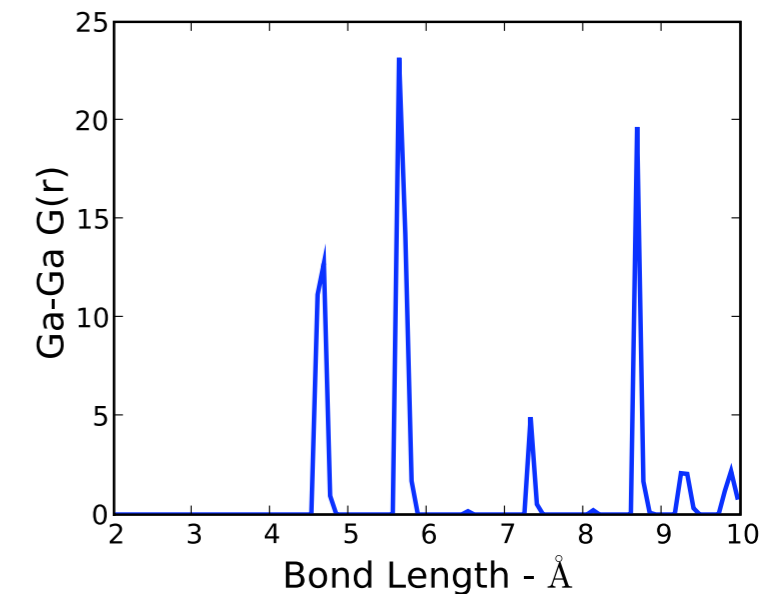
- FCC phase Pu with arbitrary 5% substitutional Ga.



Substitutional Ga lowers the PE of surrounding Pu matrix

- Ga ordering determined using lattice Monte Carlo

- Results in no 1st nearest neighbour (1NN) Ga-Ga bonds

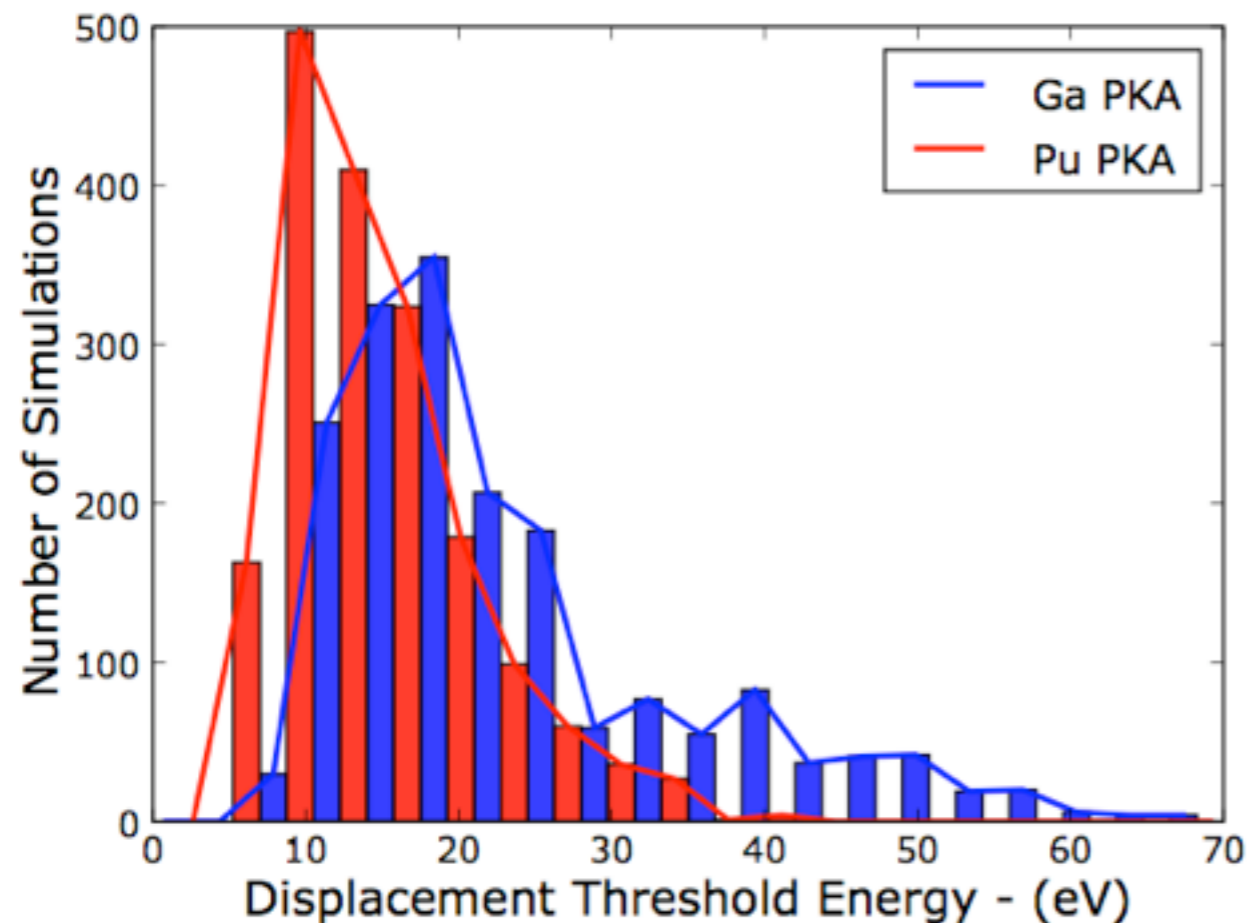
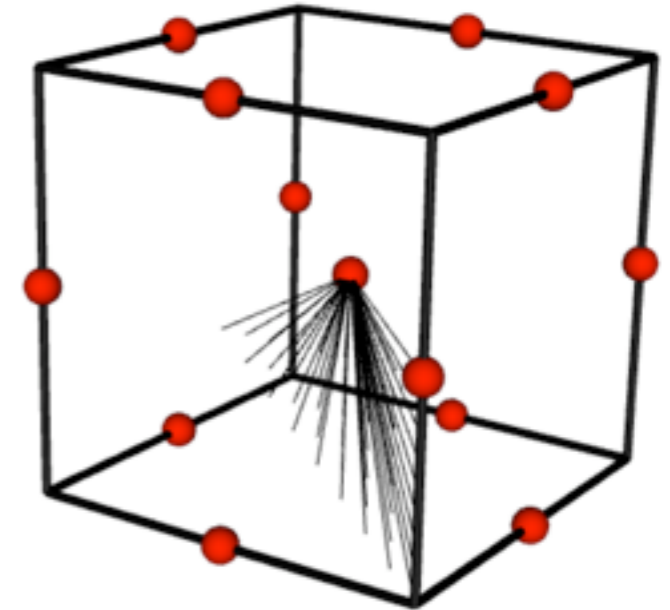


***Impact on LTSD techniques - resultant crystal structure highly inhomogeneous***



# Application - Ga stabilised Pu

- A first look at the ballistic phase
- The effect of Ga on: *Threshold displacement energy  $E_d$* 
  - *“Minimum energy required to displace an atom as to create a Frenkel (vacancy-interstitial) Pair”*
- ▶ Low energy cascades (< 200 eV) initiated in a irreducible volume.



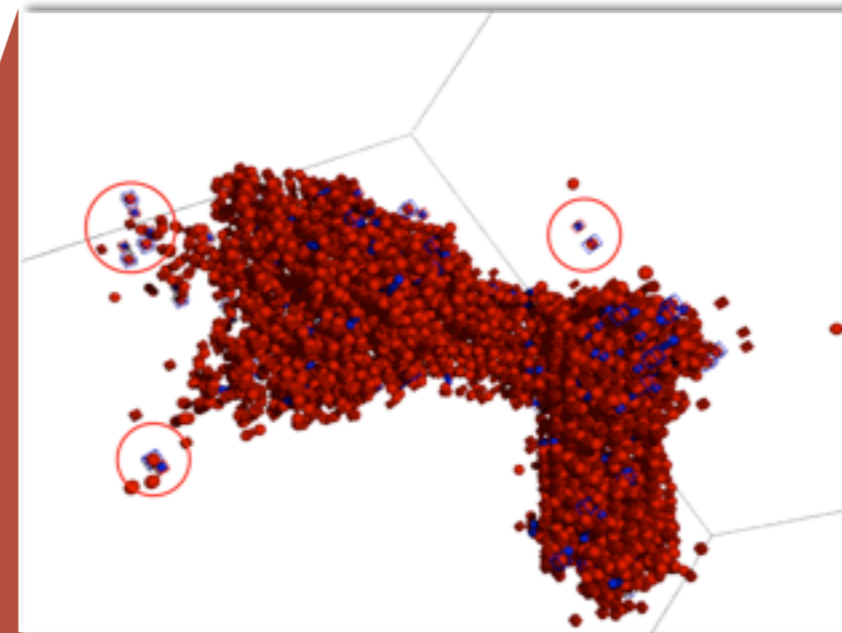
- Overall increase in  $E_d$  for the **Ga PKA**



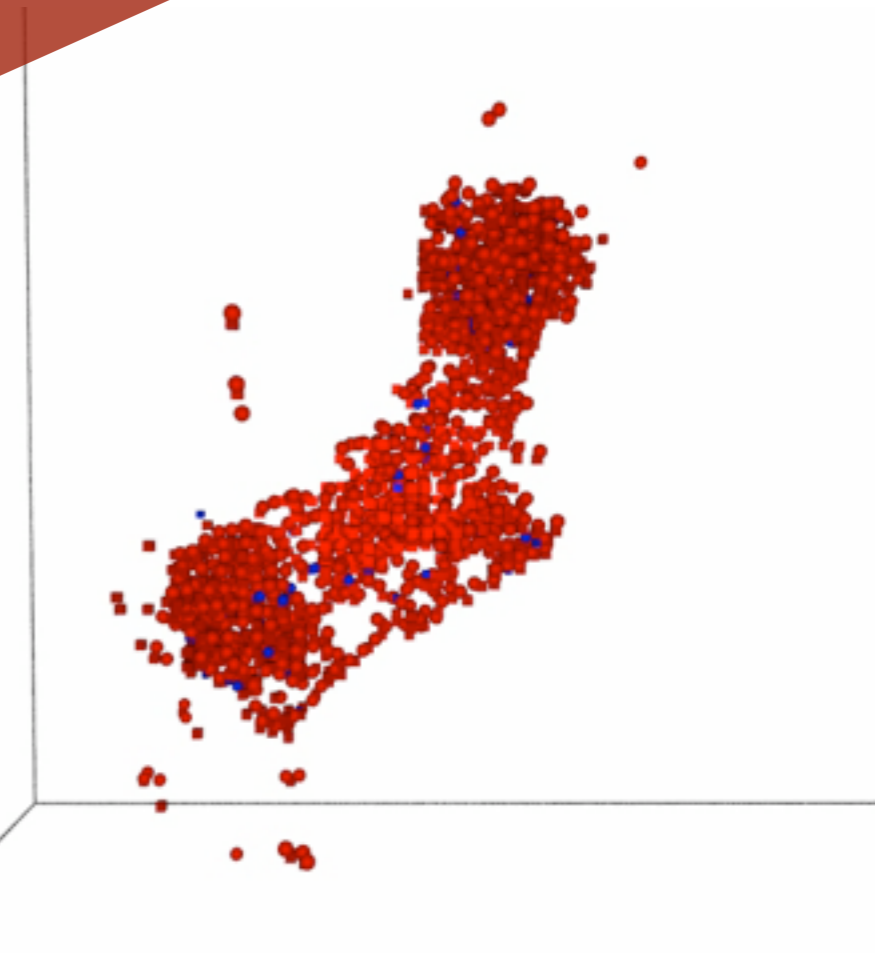
# Application - Ga stabilised Pu

- Cascade Results**

Pu 5 at. % Ga 5 keV Cascades Defect Analysis				
	Ga	Pu	Mixed	Total
Constituents				
Vacancies	1	298	N/A	299
Interstitials	2	303	N/A	305
Anti-Sites	123	131	N/A	254
Defect Categories				
Lone Interstitials	0	246	N/A	246
Lone Vacancies	0	250	N/A	250
Lone Anti-Sites	8	19	N/A	27
1NN Di-Vacancies	0	1	0	1
2NN Di-Vacancies	0	2	0	2
Tri-Vacancies	0	1	0	1
1NN Di-Interstitials	0	11	0	11
2NN Di-Interstitials	0	2	0	2
Tri-Interstitials	0	0	0	0
1NN Di-Anti-Sites	0	0	95	95
2NN Di-Anti-Sites	0	0	1	1
Tri-Anti-Sites	0	0	0	0
Anti-site + Mono-Vacancies	0	2	0	2
Anti-site + Mono-Interstitials	2	0	0	2
Split-Interstitials	0	1	1	2
Split-Vacancies	0	4	1	5
Vacancy-Interstitials	0	12	0	12
Unclassified Tri-Defects	0	3	16	19



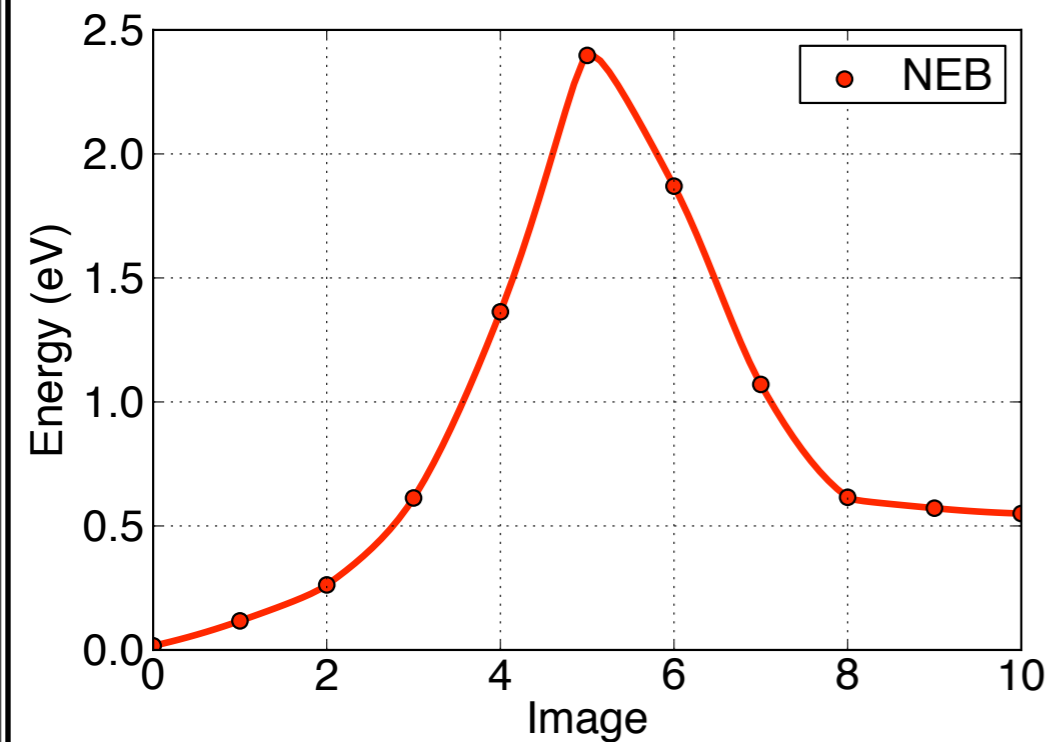
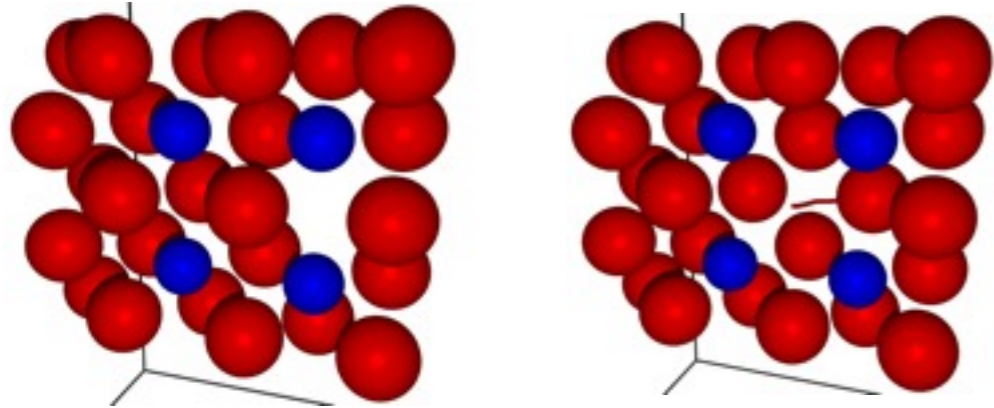
Large build up of 1NN mixed specie anti-site defects



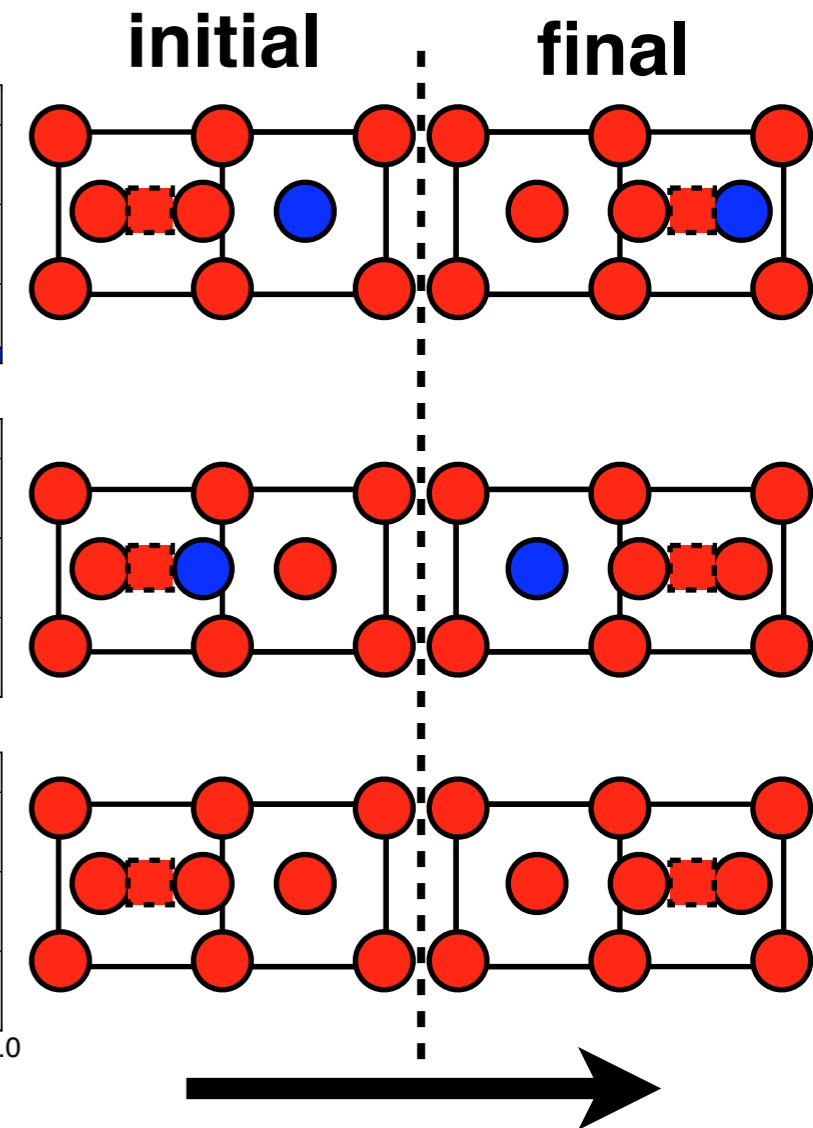
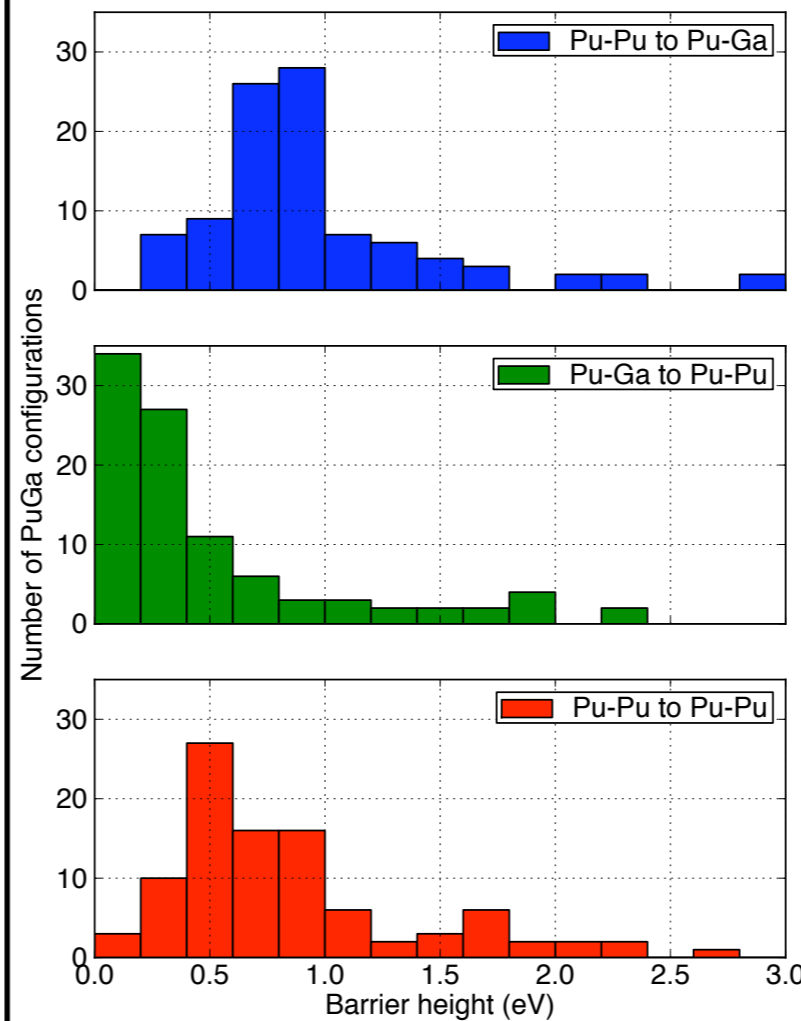
# Application - Ga stabilised Pu

- Simple Transition barrier results
  - (~ 25 different transitions in 100 PuGa lattices)

## Mono-vacancy



## $\langle 100 \rangle$ split-interstitials



- Interstitial barriers  $\ll$  vacancy barriers
- The creation of vacancies by the displacement of Ga atoms is highly unfavourable.

# Application - Ga stabilised Pu

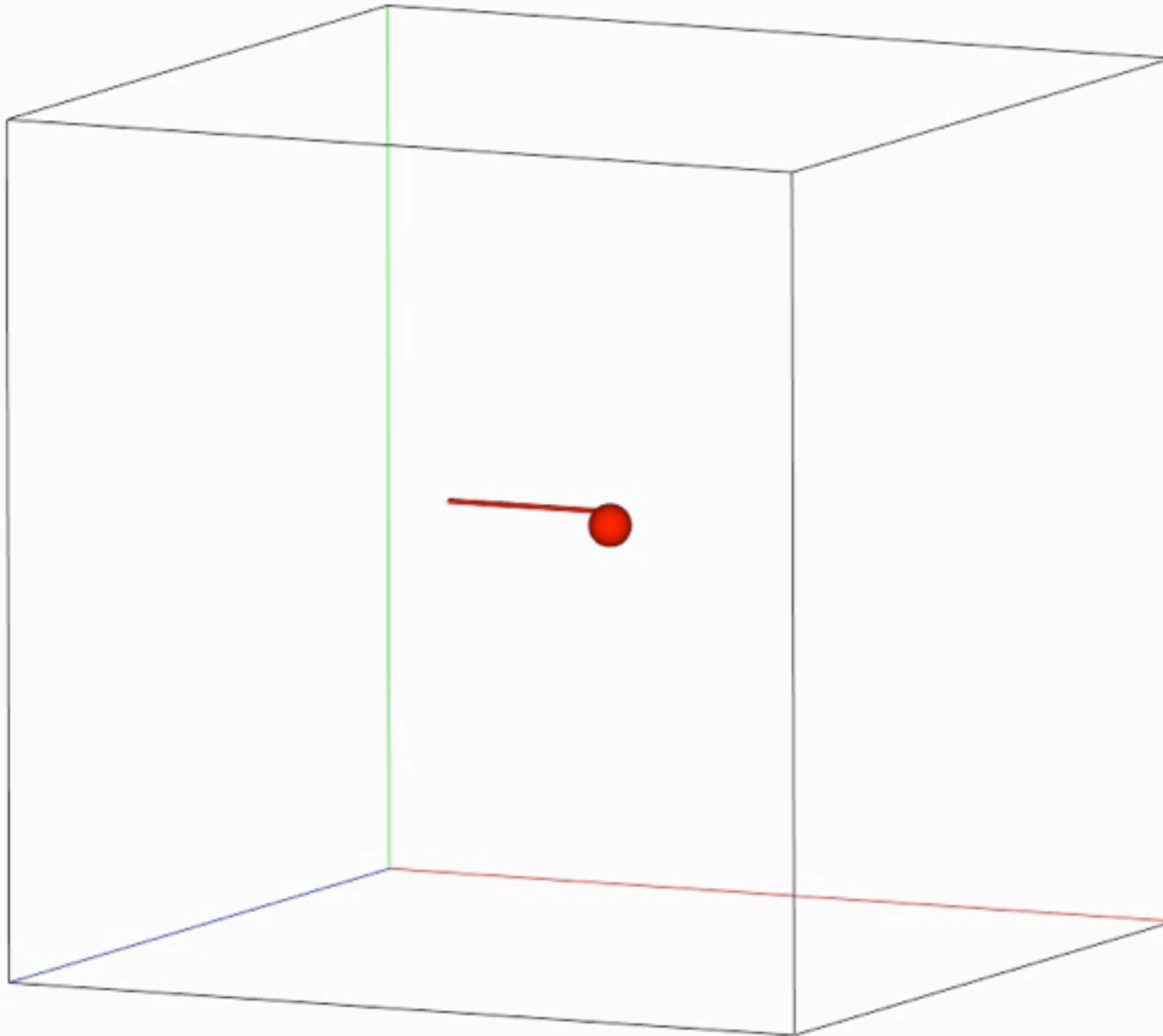
- On-the-fly KMC of Pu split-interstitial
  - Due to the low energy barriers associated with split-interstitials, **diffusion occurs quickly** ~ns.
  - Defect migrates through a **succession of Pu atomic replacements**
  - But what about the **effect of the substitutional Ga ? ...**

Simulated time: 842.24 ns



# Application - Ga stabilised Pu

- On-the-fly KMC of Pu split-interstitial



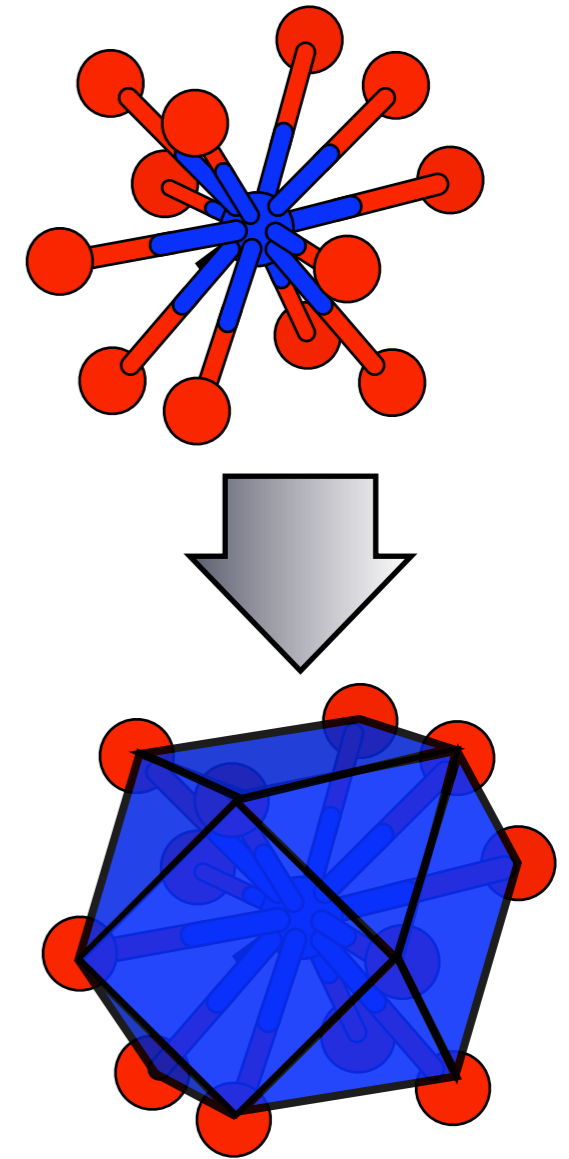
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- On-the-fly KMC of Pu split-interstitial



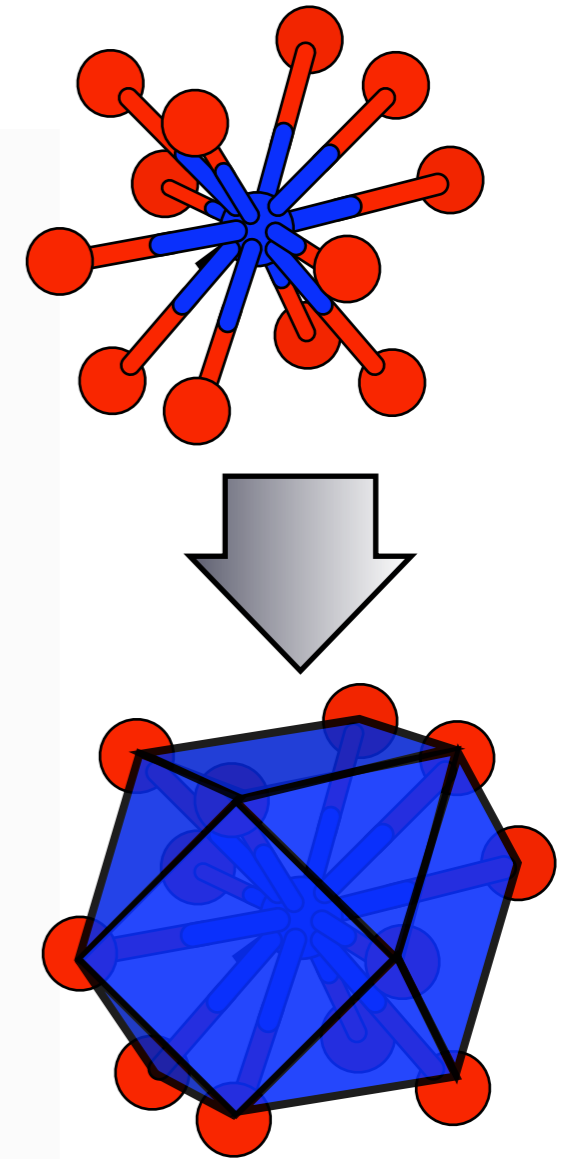
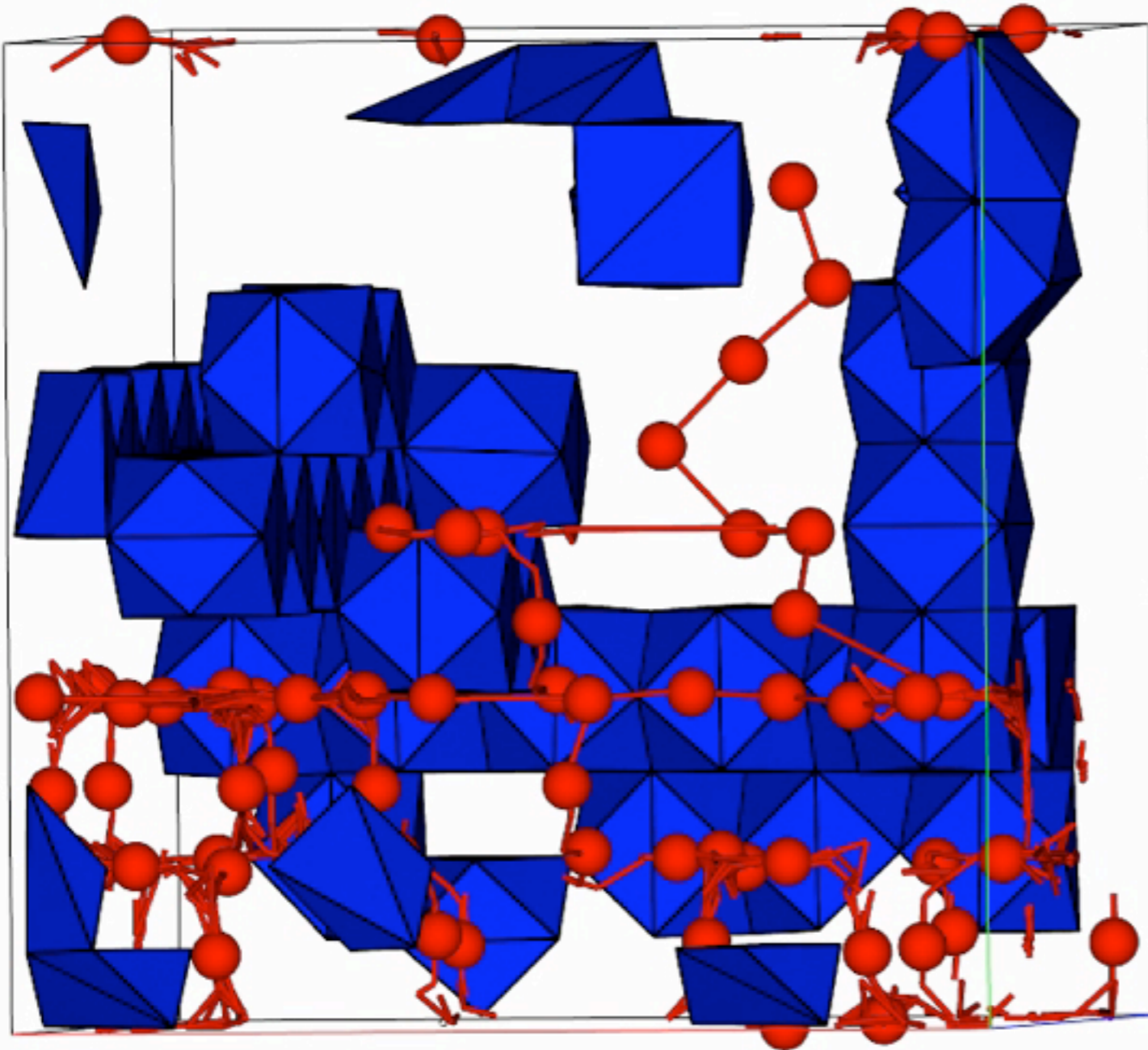
- By rendering the Ga-Pu polyhedra, it becomes clear that the **interstitial migration is confined to Pu rich regions.**





# Application - Ga stabilised Pu

- On-the-fly KMC of Pu split-interstitial



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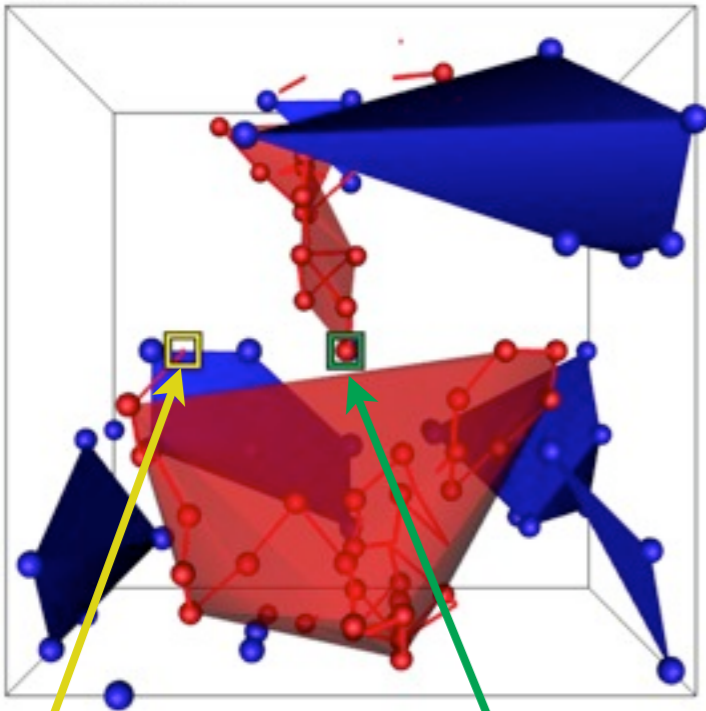




# Application - Ga stabilised Pu

- On-the-fly KMC of Pu mono-vacancy.

2 d 18 h 25 m 58.82 s



Final mono-vacancy position

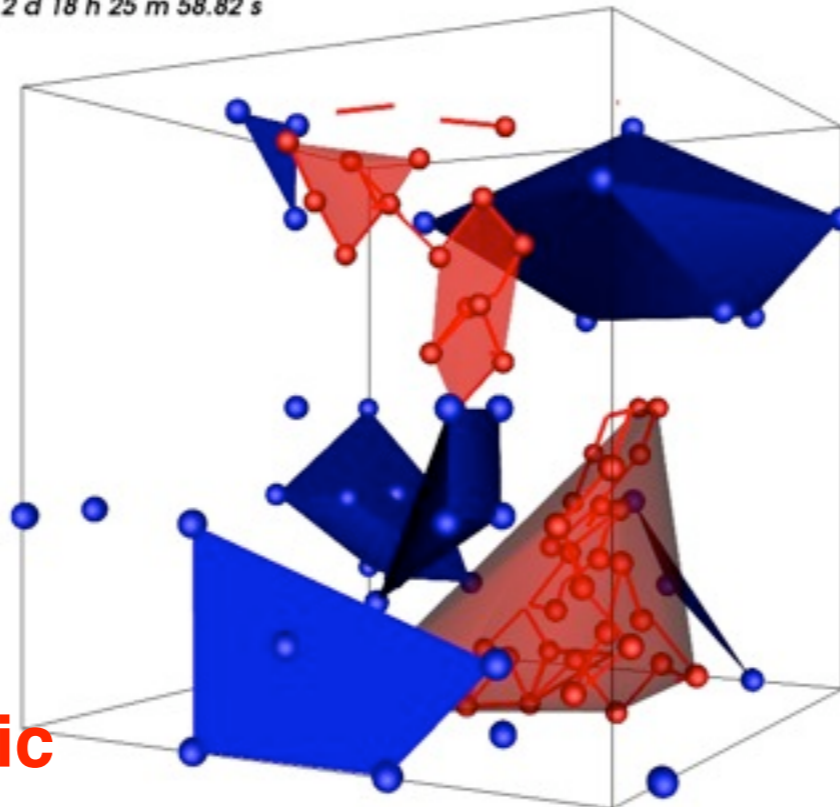
Initial mono-vacancy position

Ga rich regions

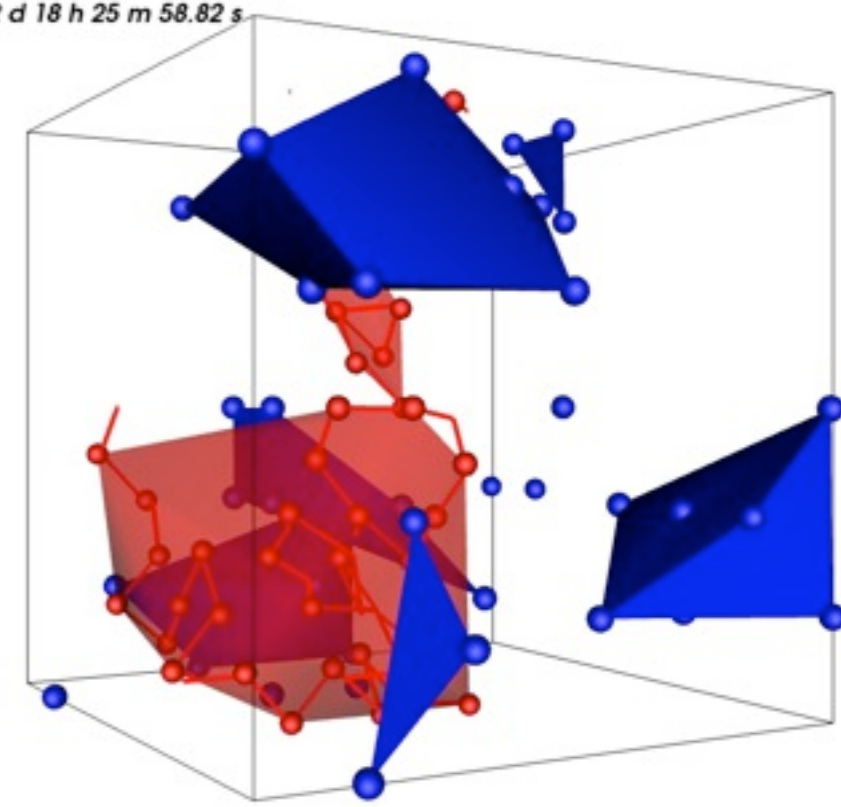
Regions containing atomic displacements

- The same is also true for vacancy migration, with the **migration pathway avoiding Ga-rich regions.**
- As the lowest energy barriers for vacancy transitions are higher than interstitial, the **time scale for migration is significantly increased.**

2 d 18 h 25 m 58.82 s



2 d 18 h 25 m 58.82 s



# Application - Ga stabilised Pu

- **Conclusions:**
  - ▶ We have built up a picture of radiation damage in Ga-stabilised Pu, showing the effect of Ga on:
    - **Ballistic phase - Threshold displacement energies.**
      - Higher value of  $E_d$  for the Ga PKA.
    - **Ballistic phase - Cascade damage.**
      - No outlying Ga defects
      - Build up of 1NN 'anti-sites' i.e. Pu-Ga switching during the cascade
    - **Recovery phase - Transition barriers.**
      - High energy barriers associated with introducing vacancies and interstitials into Ga rich regions.
    - **Recovery phase - Diffusion mechanisms.**
      - Pu defect migrations is confined to Pu-rich zones, bounded by Ga-Pu polyhedra.
- **TODO: Cascade overlap, effect of GB, varying at.% Ga, migration of complex defect structures. - requires robust LTSD methods!**



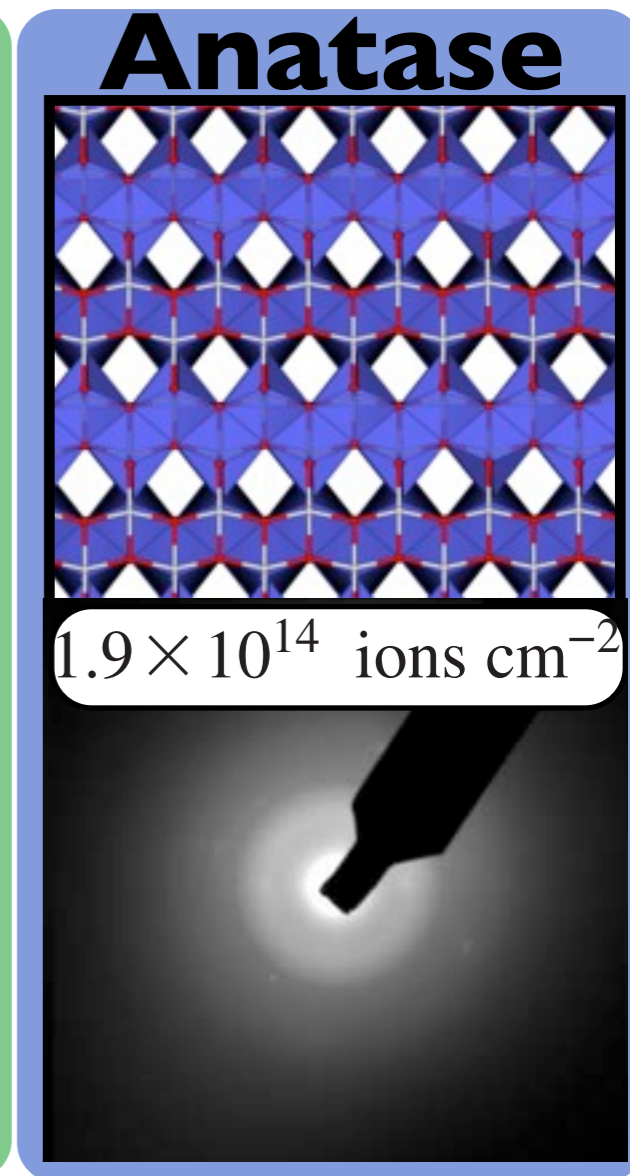
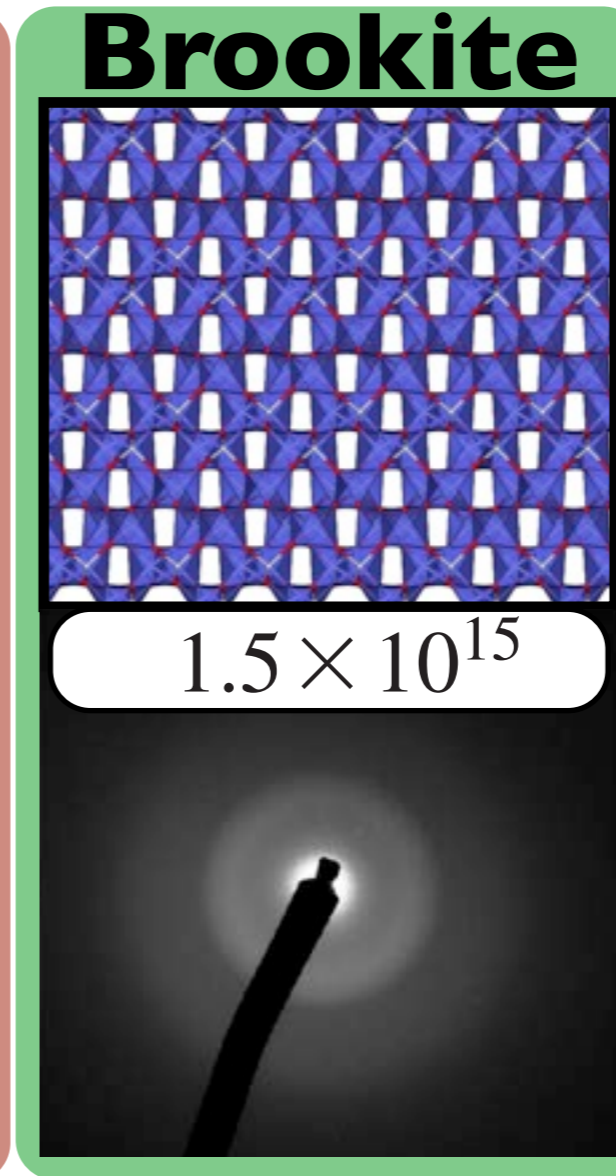
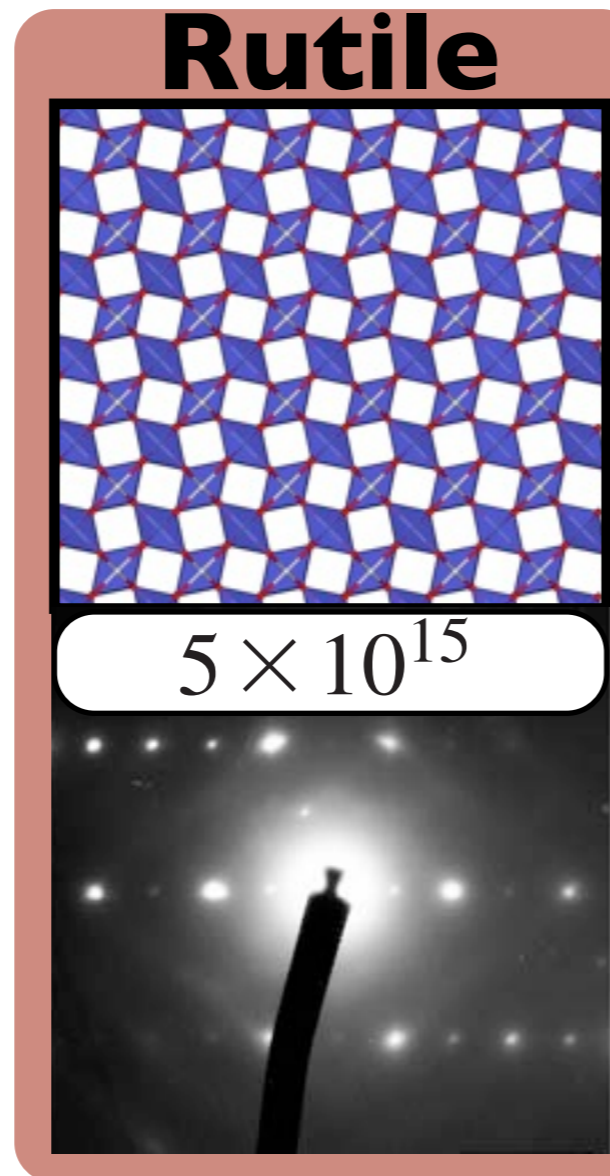
## **Application 2**

***The effect of structure on radiation damage: A case study in  $TiO_2$***



# Application - $TiO_2$

- **Rutile** application as a nuclear waste form, i.e. **Synroc**, and has a high tolerance to radiation damage.
- The **Anatase** and **Brookite** polymorphs behave differently with **Anatase** exhibiting a much **higher susceptibility** to radiation damage.



Increasing susceptibility to amorphisation



# Application - Ga stabilised Pu

- Aim
  - ▶ To study the low energy radiation response of the low pressure polymorphs of TiO<sub>2</sub>
    - Reproduce trends found in experiments.
    - Investigate the atomic level differences in radiation response.
  - ▶ A transferable and generalised method of simulation and analysis of low energy radiation events.
    - As a method of calculating the threshold displacement energy,  $E_d$ .
    - To determine defect production mechanisms and recovery processes.
    - Quantitative insight into resultant defect structures.
    - To generate comparable results between crystal structures and/or potentials.



# Application - $TiO_2$

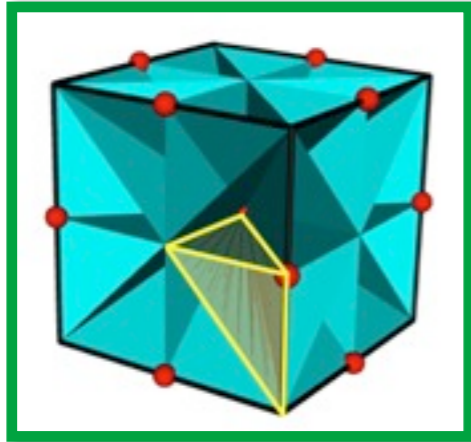
- Methodology:
  - ▶ MD cascades
    - **Matsui-Akaogi (MA)** buckingham potential<sup>1</sup> with ZBL in the DL\_POLY3 MD code.
    - Low energy cascades **< 200 eV**.
    - 10 lattices equilibrated to **300K** for between 10-15 ps.
    - 100 PKA directions chosen from a **uniform spherical distribution**.
    - Thermal and periodic boundaries.
    - MD runs of **20 ps**.
  - ▶ LTSD
    - Simple transitions, manual setup, MEP defined using CNEB.
    - Transition searches using Dimer/RAT methods
    - On-the-fly KMC - Dimer/RAT followed by CNEB

<sup>1</sup> M. Matsui and M. Akaogi, Molecular Simulation **6**, 239-244 (1991).



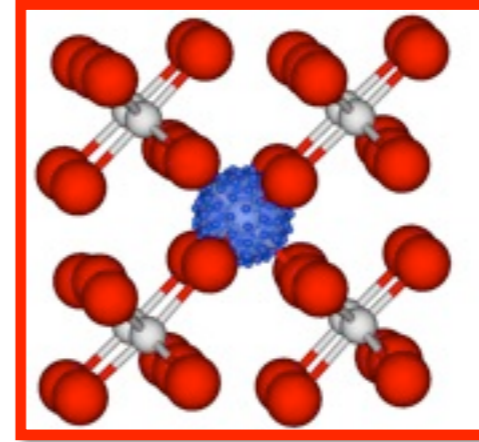
# Application - $TiO_2$

- One of the goals was to produce a **generalized and transferable** methodology to study initial defect formation and extracting quantities such as threshold displacement energy  $E_d$ .
  - Main area to automate: the determination of **PKA directions**



irreducible  
unit e.g. fcc

**X**



unit sphere  
sampling



## The Thomson Problem

*“Minimum energy configuration of point charges on the surface of a conducting sphere”*

**No analytical solution** for large  $N$ ,  
requires **numerical constrained  
minimisation.**



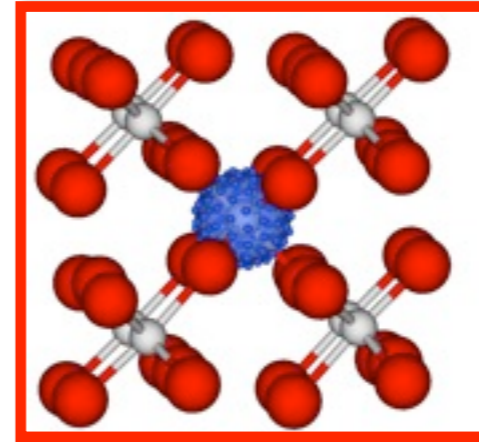
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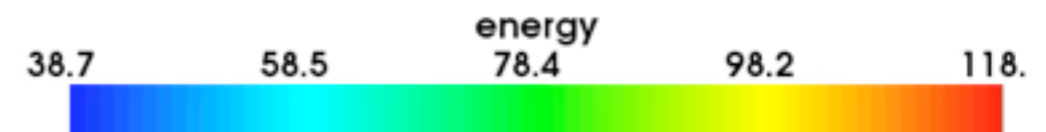
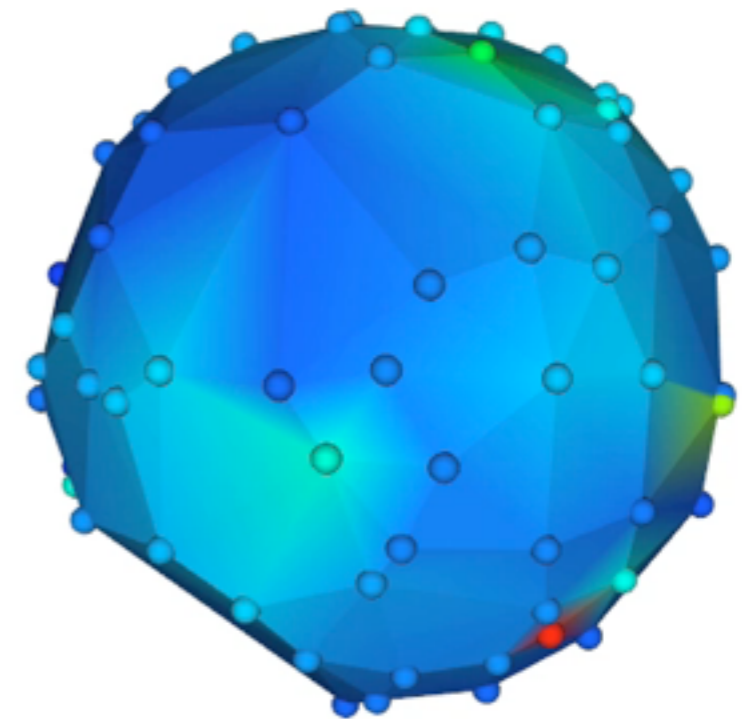
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## The Thomson Problem

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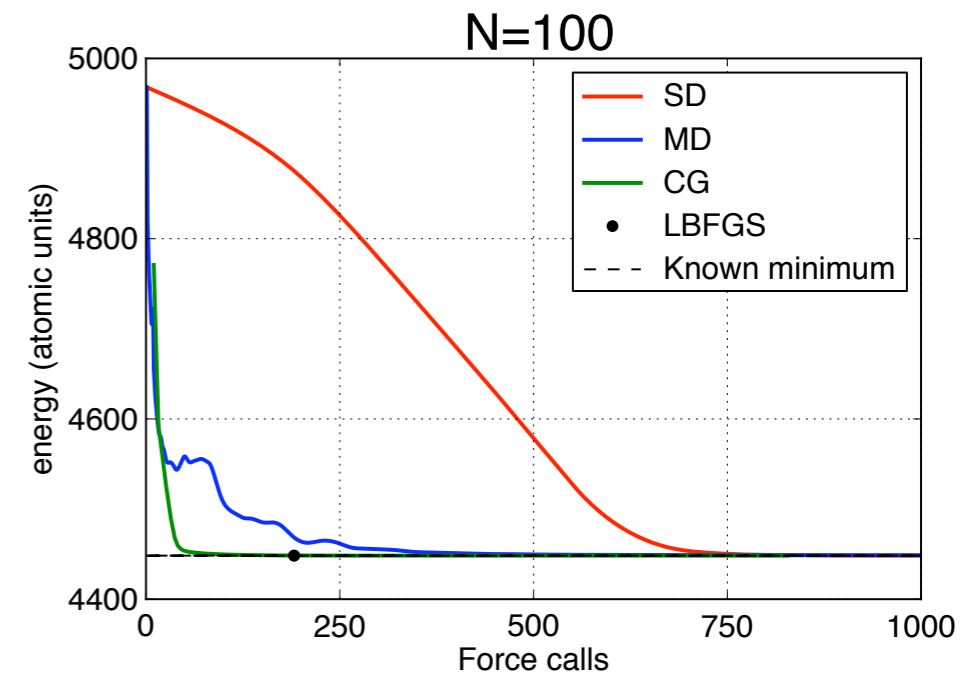
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# Application - $TiO_2$

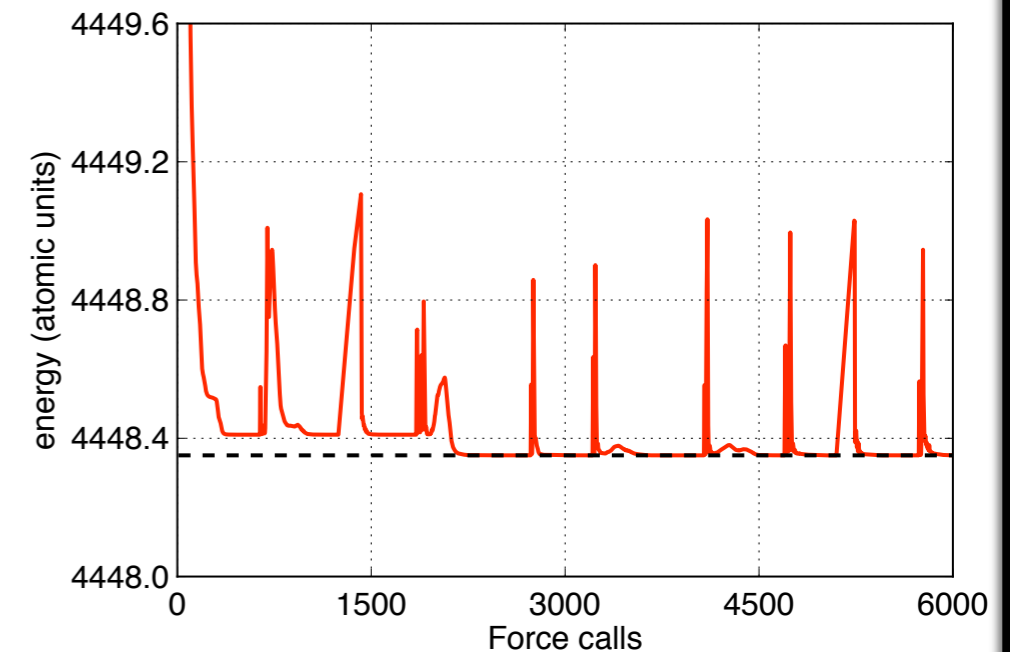
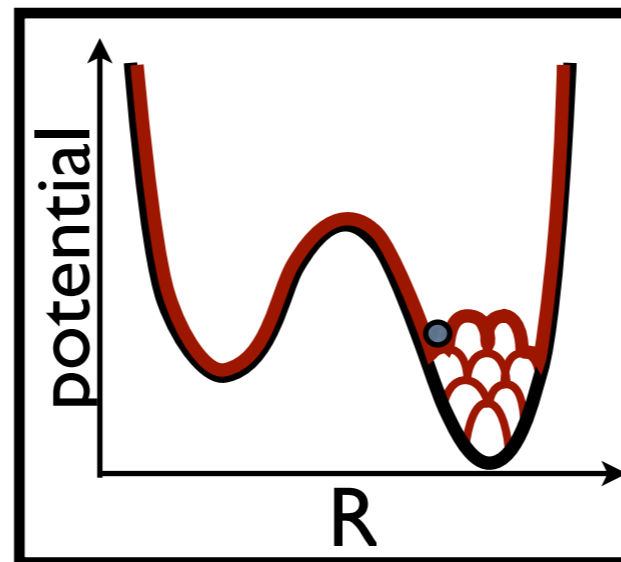
- **Finding solutions to the Thomson Problem.**

- ▶ Steepest Decent
- ▶ MD
- ▶ Conjugate Gradient
- ▶ Broyden–Fletcher–Goldfarb–Shanno (BFGS & LBFGS)



- **Exponential Increase in local minima as N increases**

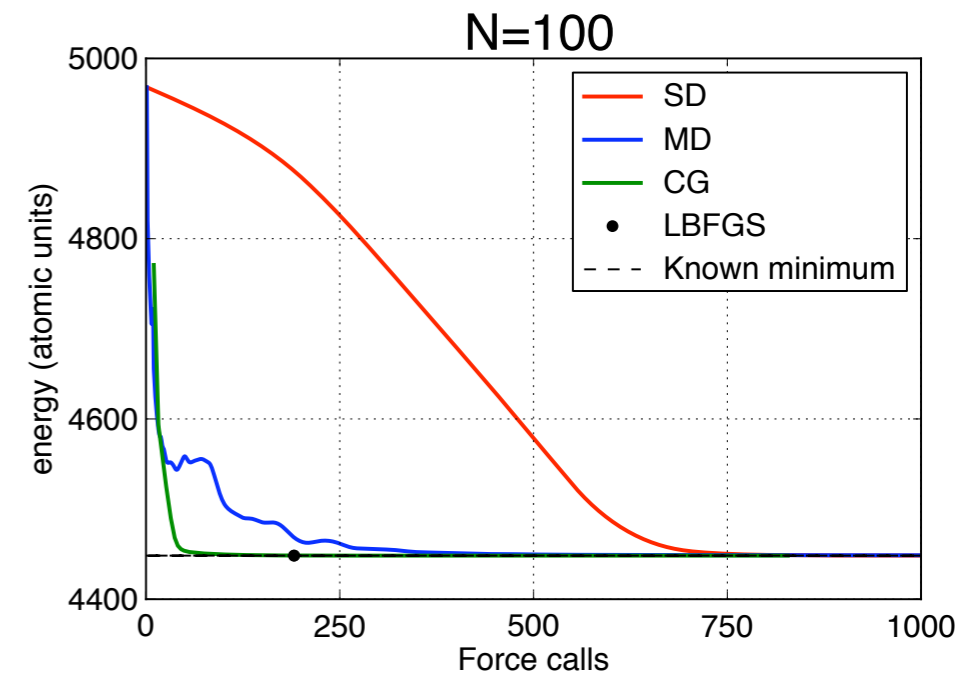
- ▶ Requires basin-hopping techniques to find global minima.



# Application - $TiO_2$

- **Finding solutions to the Thomson Problem.**

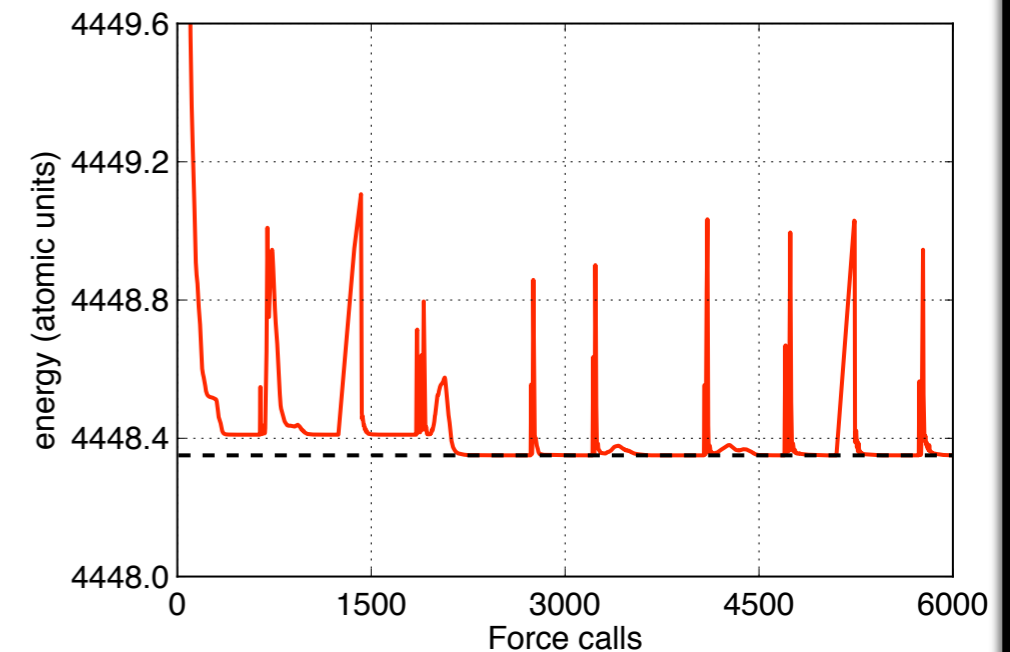
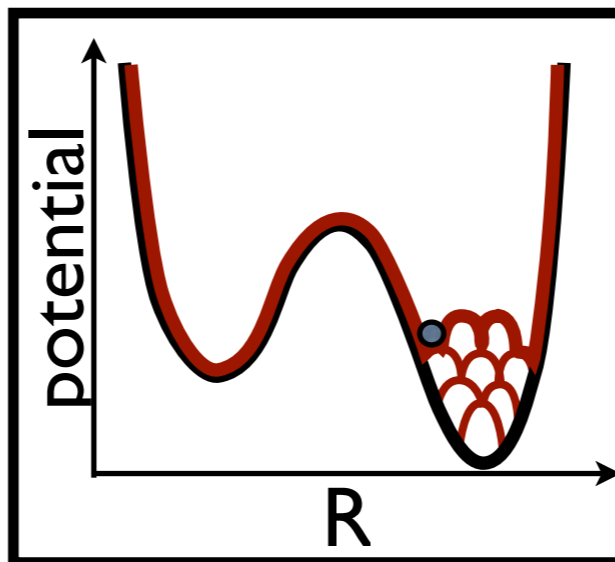
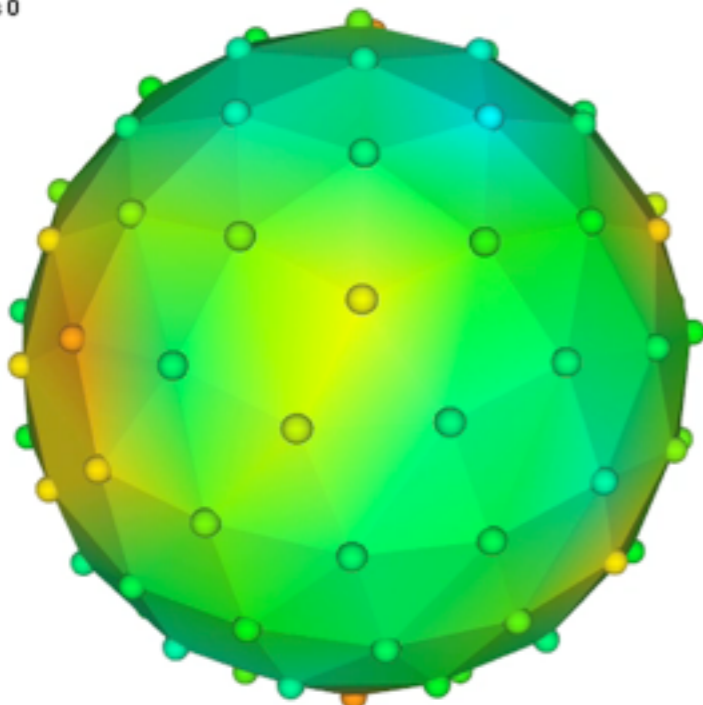
- ▶ Steepest Decent
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- ▶ Broyden–Fletcher–Goldfarb–Shanno (BFGS & LBFGS)



- **Exponential Increase in local minima as N increases**

- ▶ Requires basin-hopping techniques to find global minima.

Energy 4448.76352599  
Min Energy 4448.76352599  
Gaussians 0



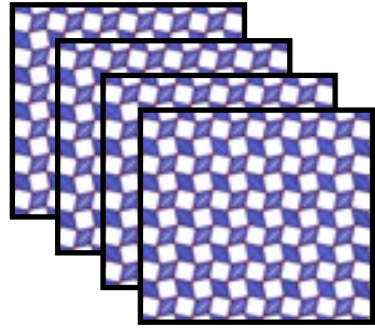
44.4 44.4 44.5 44.5 44.6



Curtin University

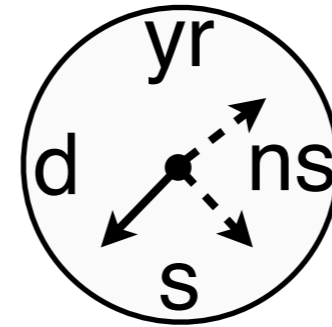


# Application - $TiO_2$



Relax and thermalise  $N_l$  lattices to  $T$  Kelvin.

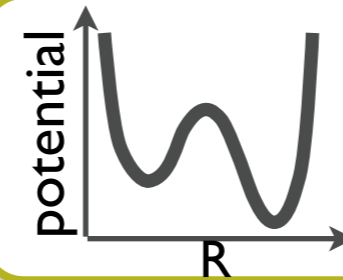
**MD**



Analysis of **recovery time** as a function of PKA energy/specie

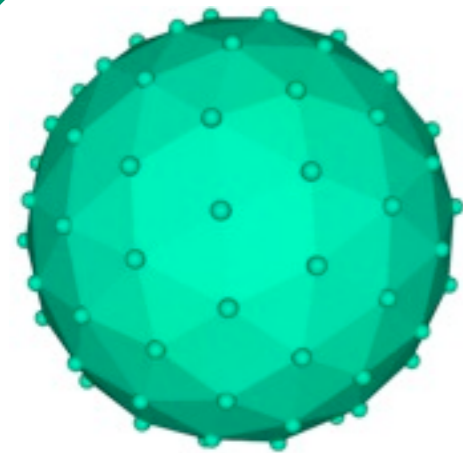
Determine unique PKAs: (Ti, O<sub>I</sub>, O<sub>II</sub>)

Choose  $E_{min}$ ,  $E_{max}$  and step size  $\Delta E$ .

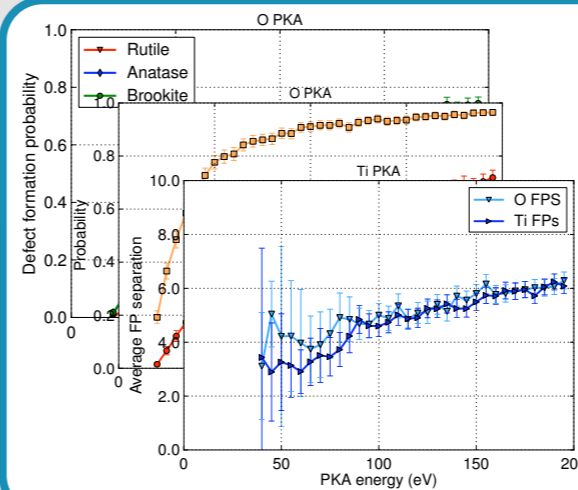


Transition searches / OTF-KMC

**LTSD**



Generate  $N_d$  PKA directions from solutions to the Thomson Problem



Post analysis: DFP, FP separations ...

In each lattice, for each unique PKA, energy and direction, run MD collision cascades for  $t$  ps.

**MD**

```

10 <1.1234 0.1234 0.543> | 0 10 2
20 <1.1234 0.1234 0.543> | 1 10 2
30 <1.1234 0.1234 0.543> | 0 14 2
40 <1.1234 0.1234 0.543> | 0 30 2
50 <1.1234 0.1234 0.543> | 0 40 2
60 <1.1234 0.1234 0.543> | 0 60 2
70 <1.1234 0.1234 0.543> | 0 76 2
    
```

On-the-fly analysis: Frenkel pairs, replacements ...

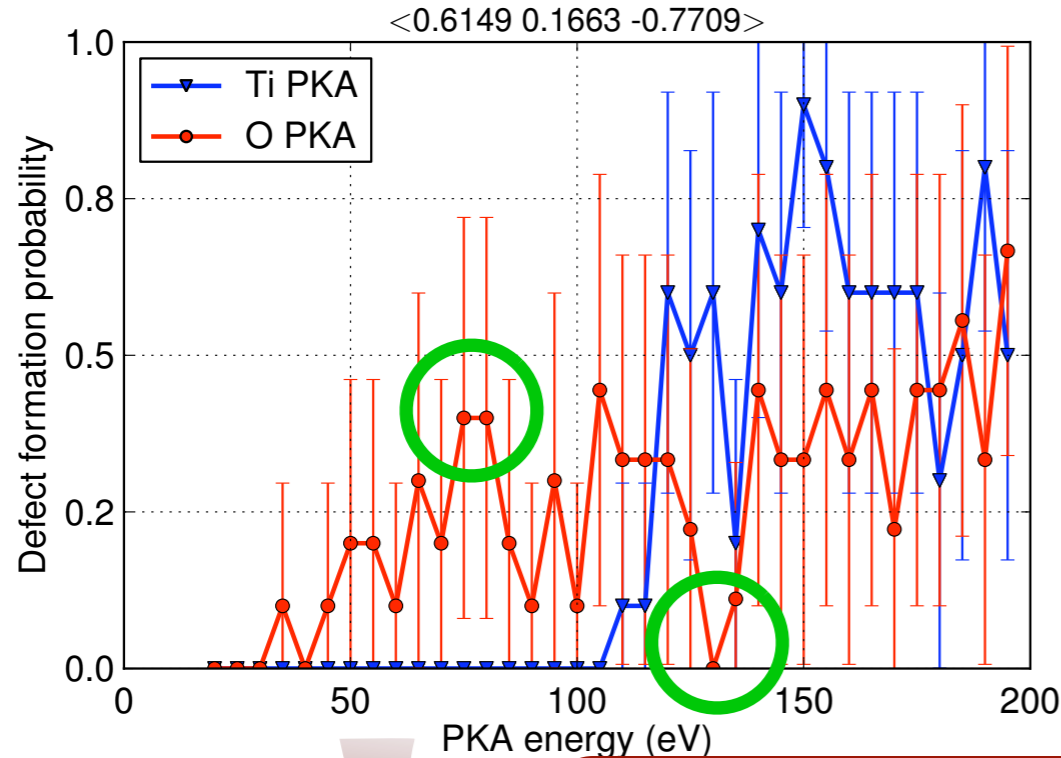




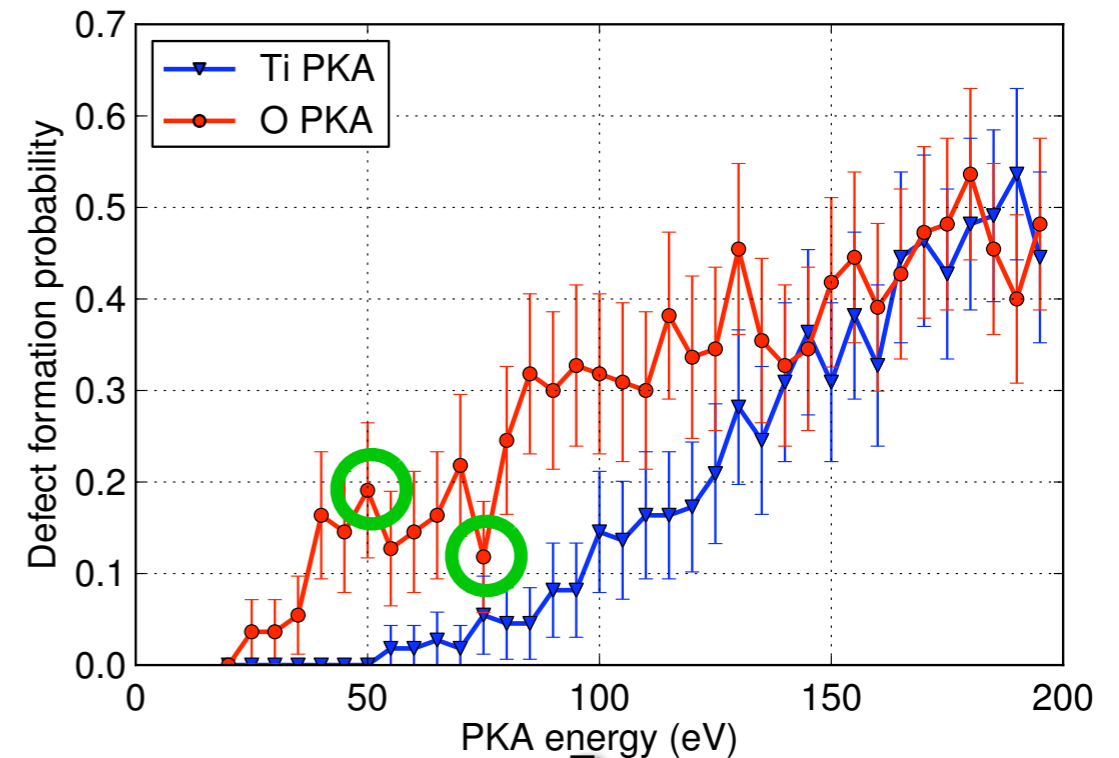
# Application - $TiO_2$

- The importance of high sampling to generate representative results

I PKA direction = **720** MD simulations

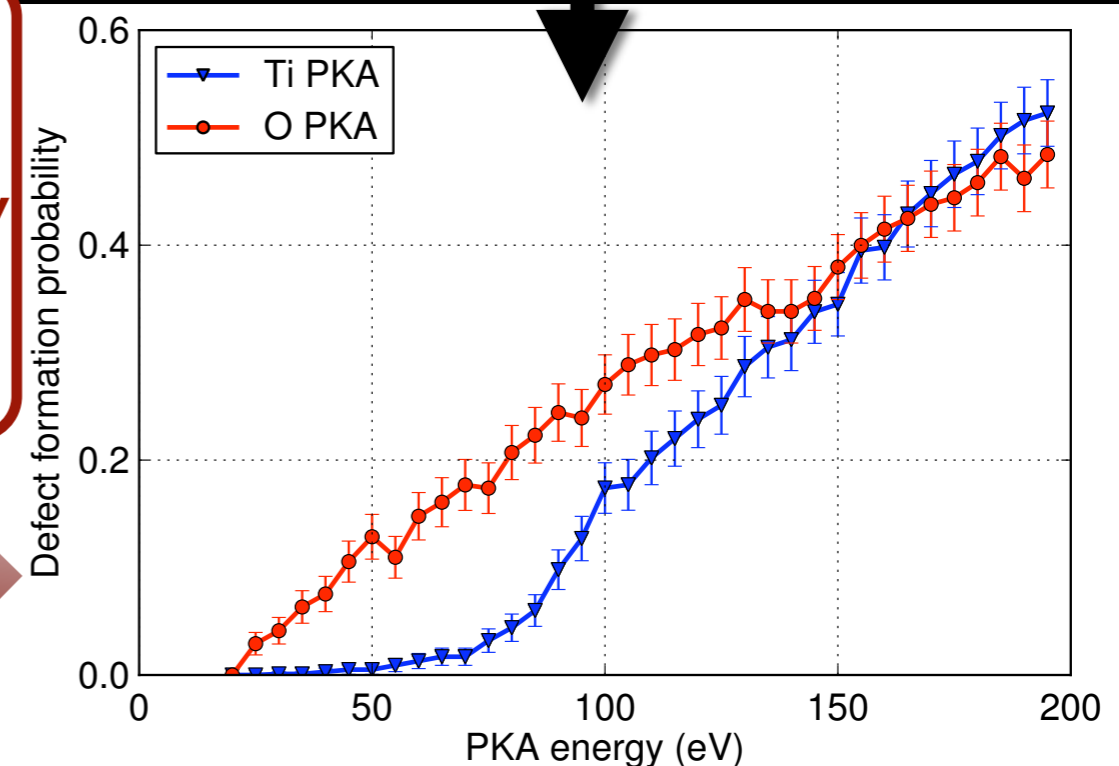


IO PKA directions = **7200** MD simulations



The 'noise' generated from sampling 1 PKA direction is significantly reduced as sampling increases.

- Defect formation probability (DFP)** - The probability of defect formation at a given PKA energy over all **directions** and **lattices**.



I100 PKA directions = MD **72000** simulations

\*Error bars represent 95% confidence interval in SEM

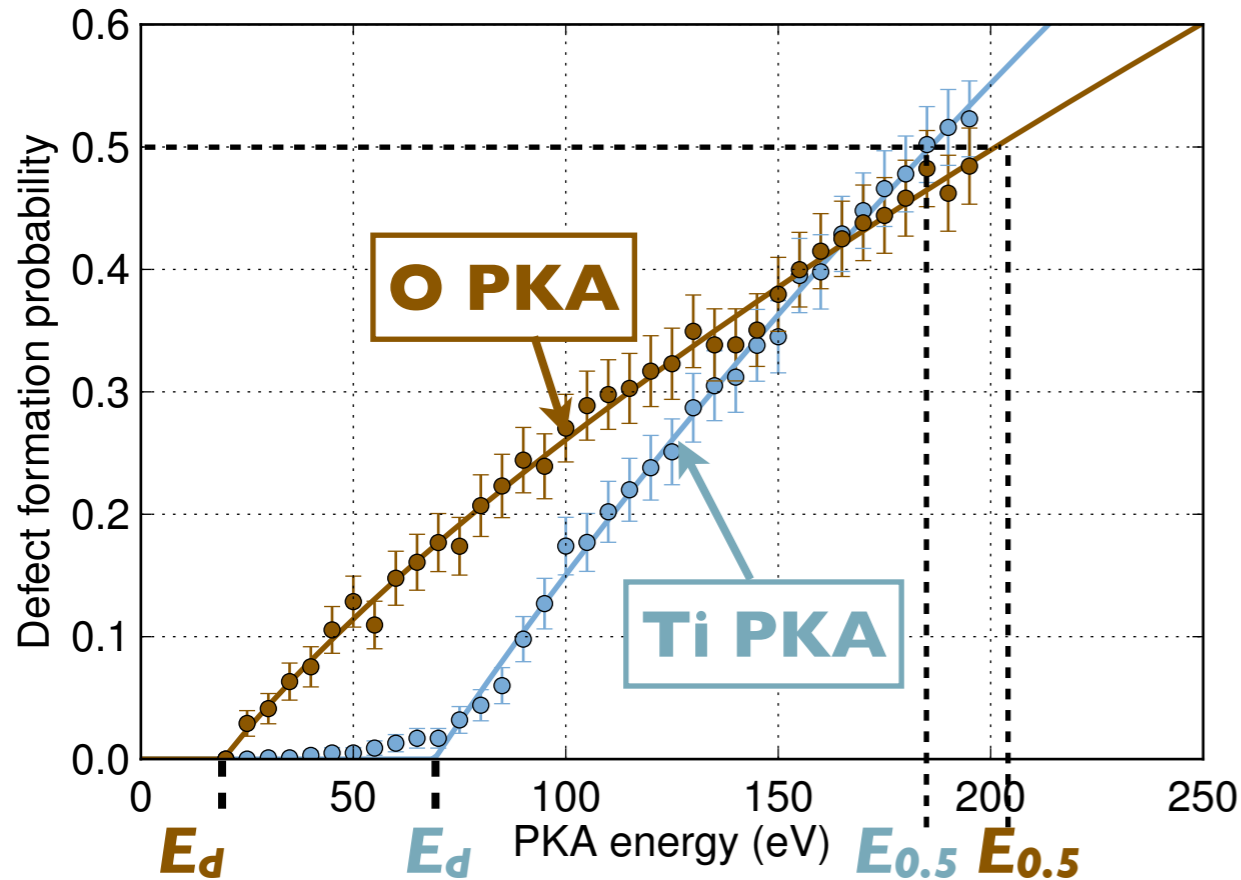


# Application - $TiO_2$

- Quantitative analysis of the ballistic phase:

- DFP as a function of PKA energy

## Rutile



$$DFP(E_{pka}) = \begin{cases} 0 & \text{if } E_{pka} \leq E_d \\ \frac{1}{\beta}(E_{pka}^\alpha - E_d^\alpha) & \text{if } E_{pka} > E_d \end{cases}$$

Polymorph	O PKA		Ti PKA	
	$E_d$	$E_{0.5}$	$E_d$	$E_{0.5}$
<b>Rutile</b>	<b>19</b>	201	<b>69</b>	186
<b>Brookite</b>	<b>19</b>	105	<b>31</b>	120
<b>Anatase</b>	<b>15</b>	121	<b>39</b>	115

\*Energies in eV

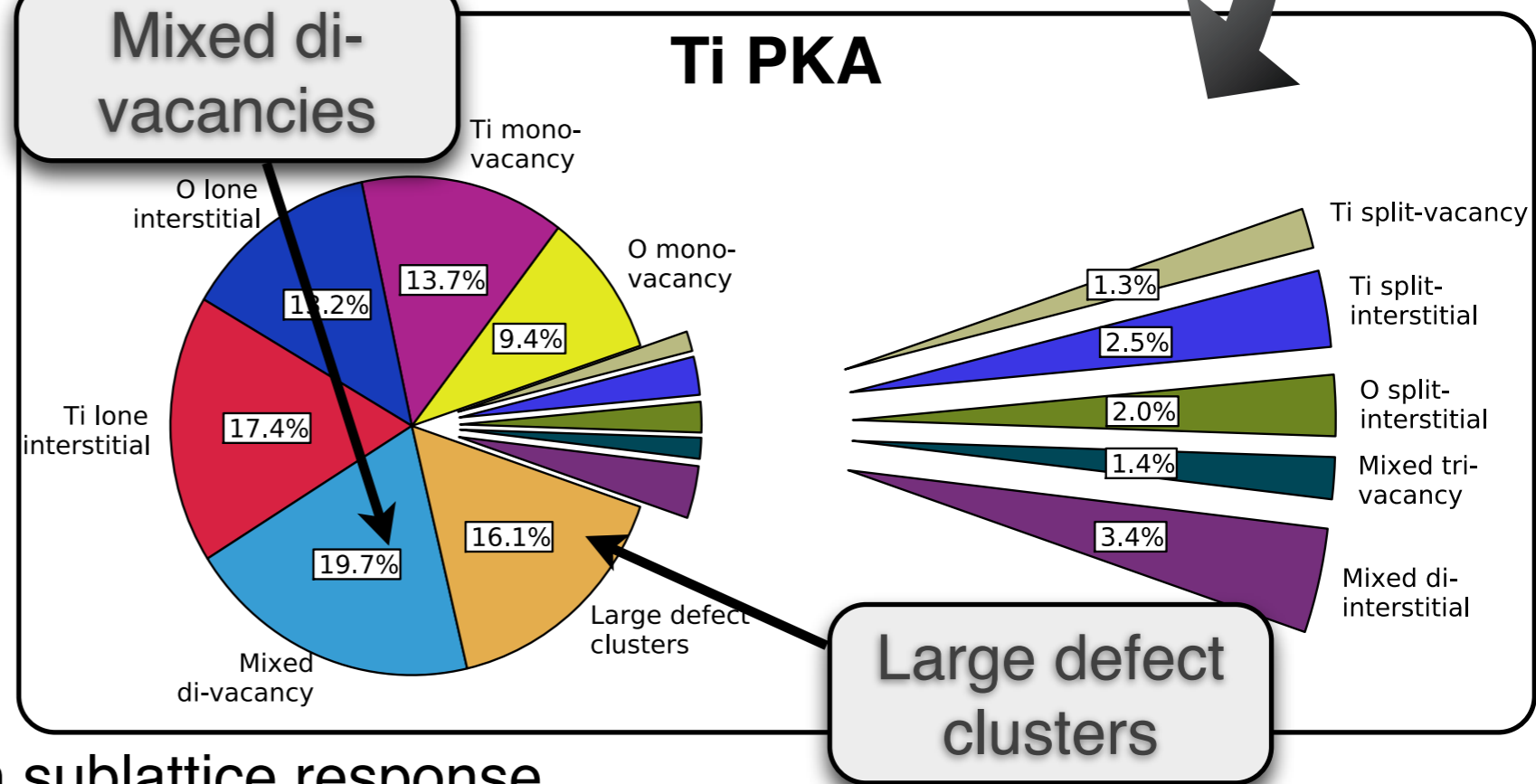
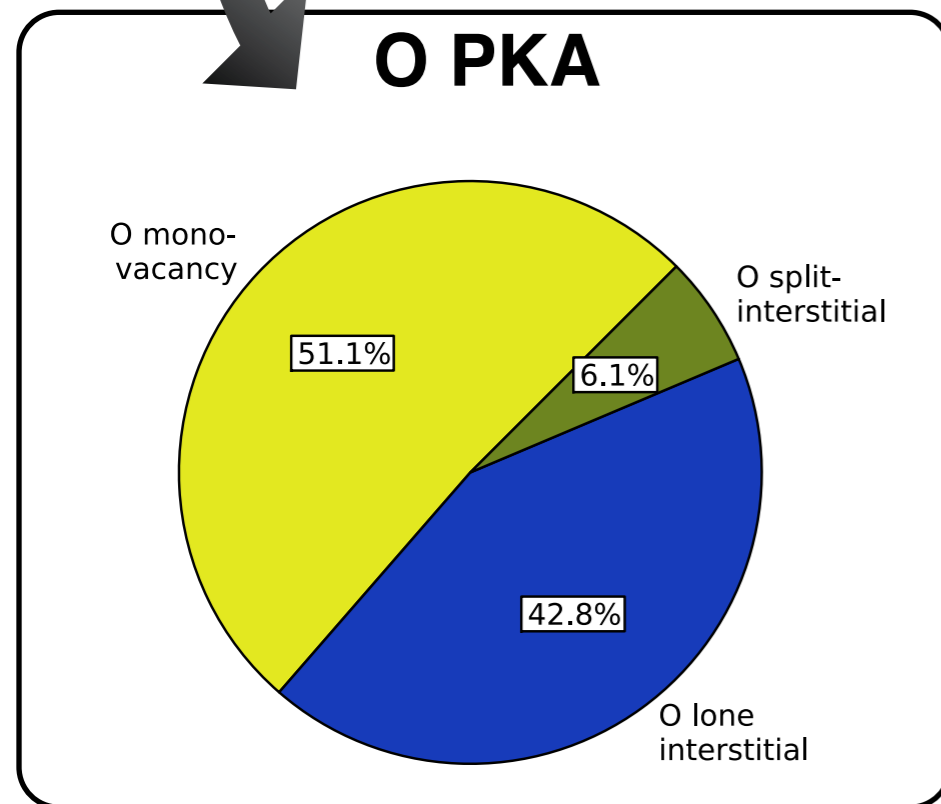
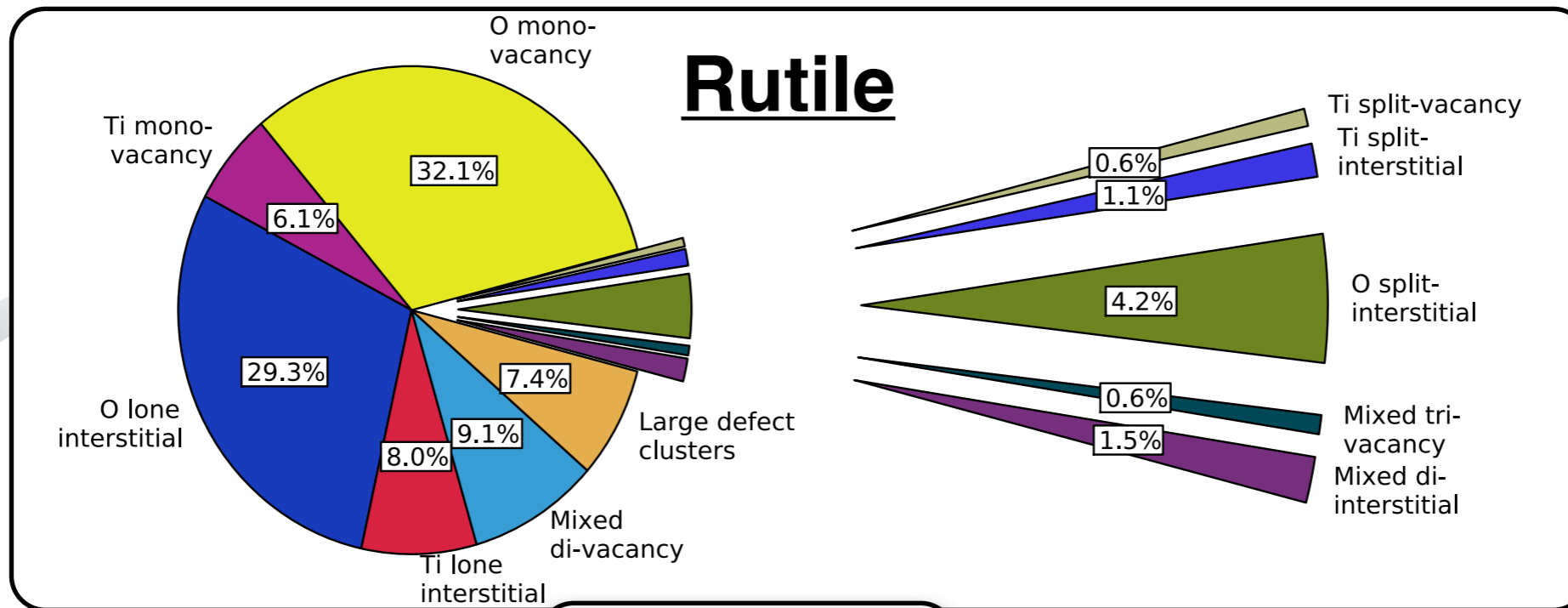
\* $E_{0.5}$  - the energy required to achieve 50% DFP

- Defect formation is **probabilistic over a large energy range**, up to at least **300-400 eV**.
- Although the  $E_d$  is **lower for O**, defect formation is more probable from Ti displacements at higher energies.
- Defect formation requires more energy in Rutile** over the energy range studied - particularly from Ti PKAs.



# Application - TiO<sub>2</sub>

- Taking an in-depth look into Rutile - Defect cluster analysis



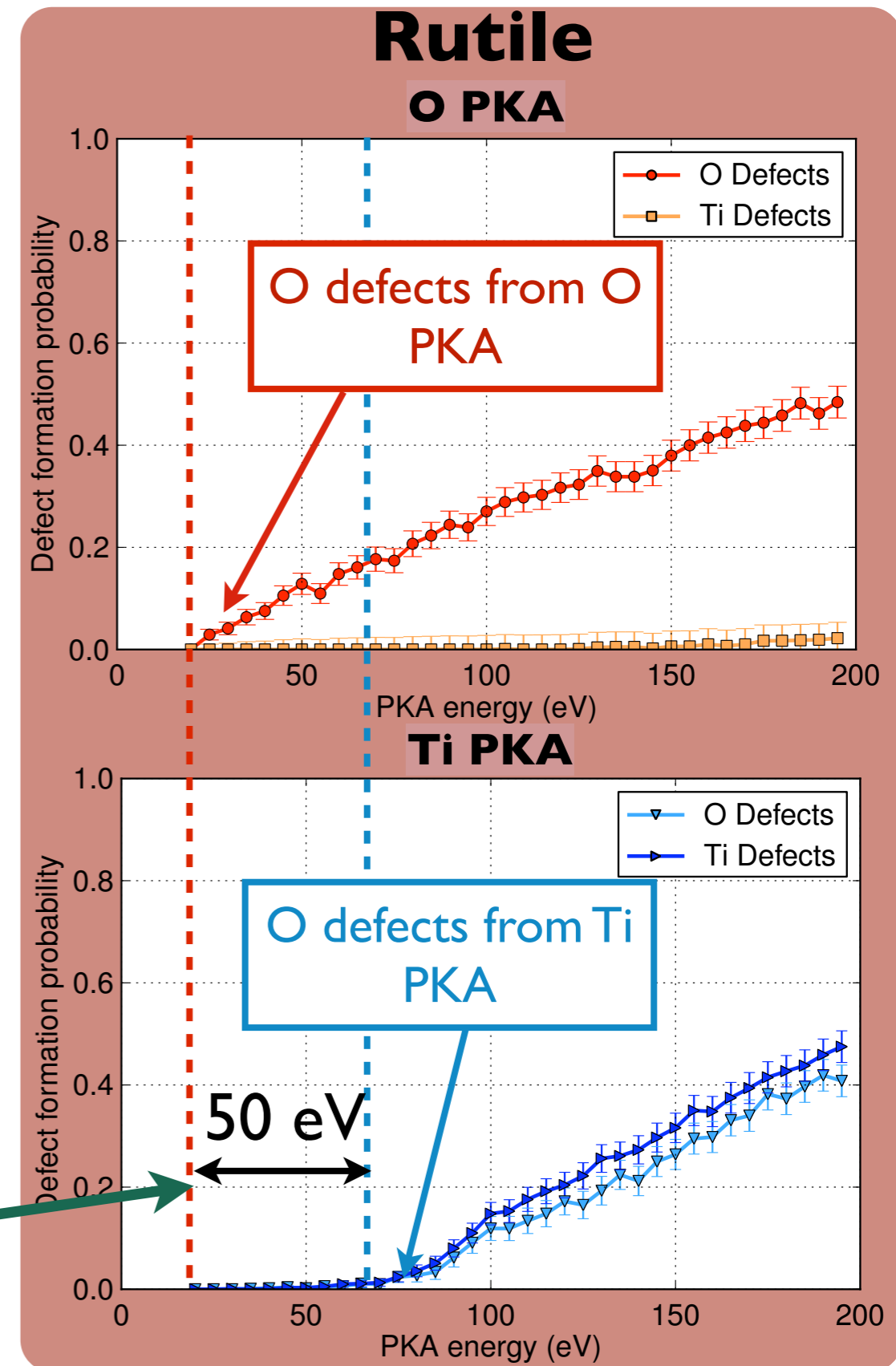
- Highlights the differences in sublattice response.
- Provides a good foundation for studies of defect migration and FP recombination *i.e.* **KMC**

# Application - $TiO_2$

- DFP categorised by the atomic specie of the defects.

## Across all polymorphs

- Predominantly O defects created by O PKAs.
  - Even proportion of Ti and O defects from Ti PKAs
- Implications for TRCS (or other methods that rely on anion vacancies)
    - Method traditionally only detects first emission i.e. O defects from O PKAs
    - Second emission relating to O defects from Ti PKAs.
      - \*Only if energy gap is sufficiently large



# Application - $TiO_2$

- **Quantitative analysis of the ballistic phase - Comparison with experiment:**
  - ▶ Experimental values of  $E_d$  for the O PKA are significantly lower than observed from the MD simulations, for example:
    - **TEM**
      - $\sim 33$  eV<sup>1</sup>
    - **TRCS** (Time-resolved Cathodoluminescence Spectroscopy)
      - $\sim 39$  eV rutile 45-50 eV for other oxides<sup>2</sup>.
- **Reasons for discrepancies**
  - **TEM -**
    - Relies on observable defect structures (saturation of point defects)
    - Always overestimate  $E_d$ .
  - **TRCS -**
    - Displaces O atoms with electron beam - observes decay of excited F-centers.

<sup>1</sup> E. C. Buck, Radiation Effects and Defects in Solids **133**, 141-152 (1995).

<sup>2</sup> K. L. Smith, R. Cooper, M. Colella, and E. R. Vance, Materials Research Society Symposium Proceedings **663**, 373-380 (2001).

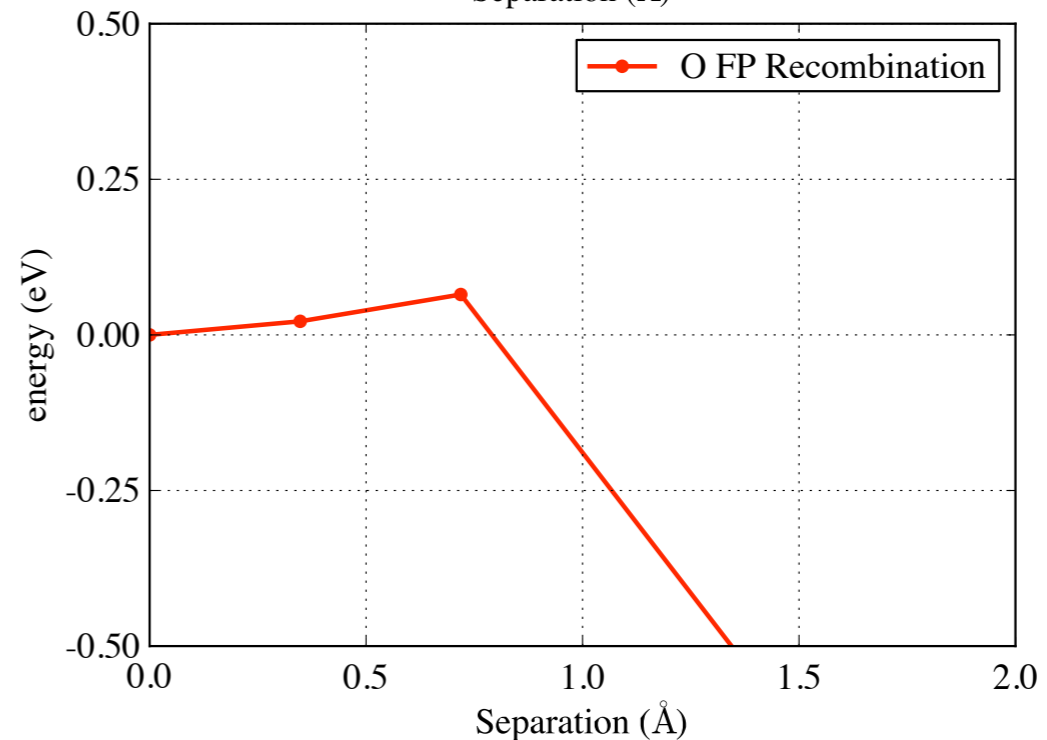
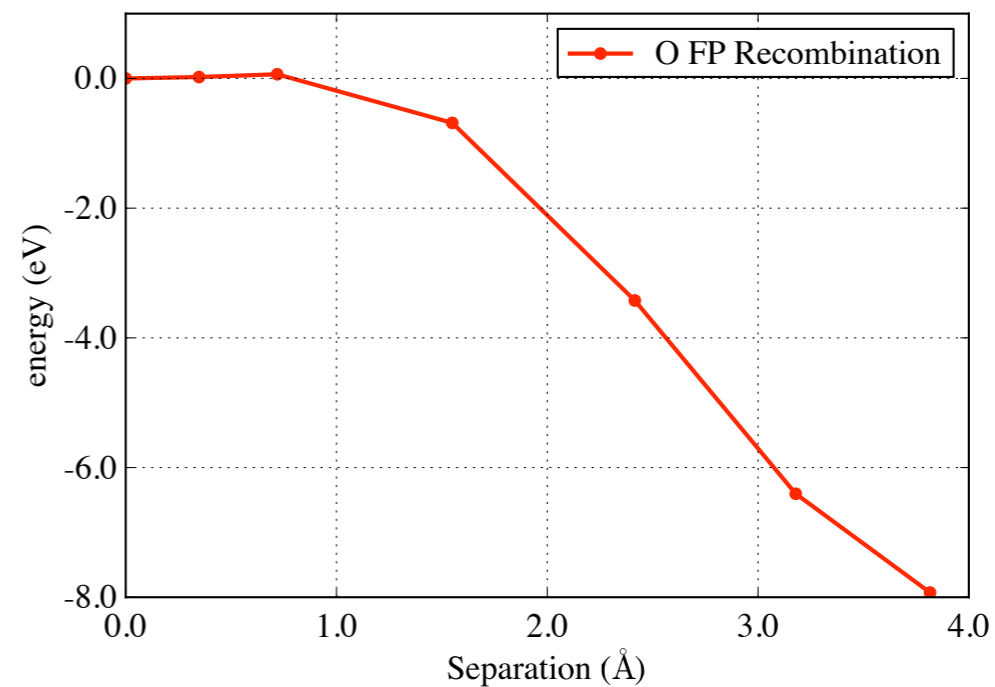


# Application - $TiO_2$

- What can happen in 25 ns? (Rutile)
  - ▶ Simple O Frenkel pair annihilation - separation around 4 Å

$\langle 101 \rangle$

- At *small* separations O FP recombination occurs on the ps time scale.
- At what separation do we see a marked increase in FP recombination barrier?

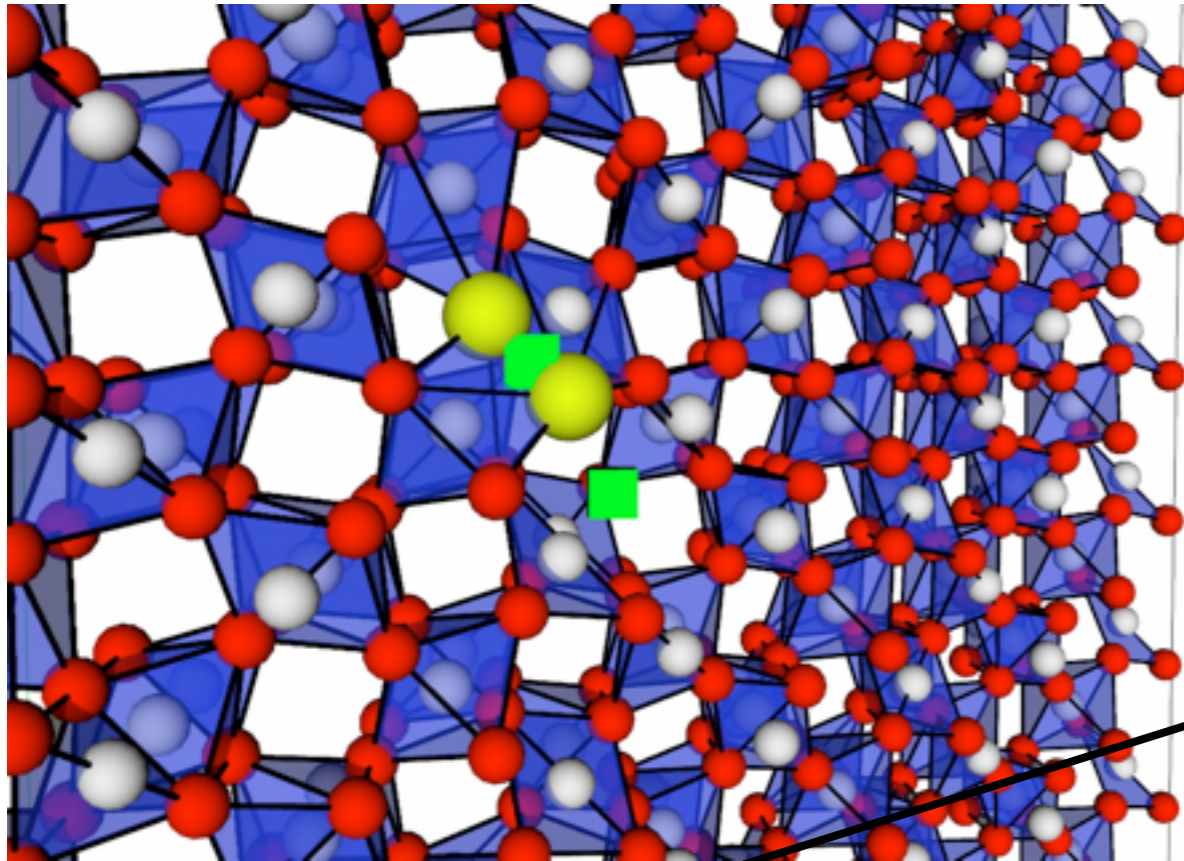


Single  
barrier  
process  
**0.07 eV**



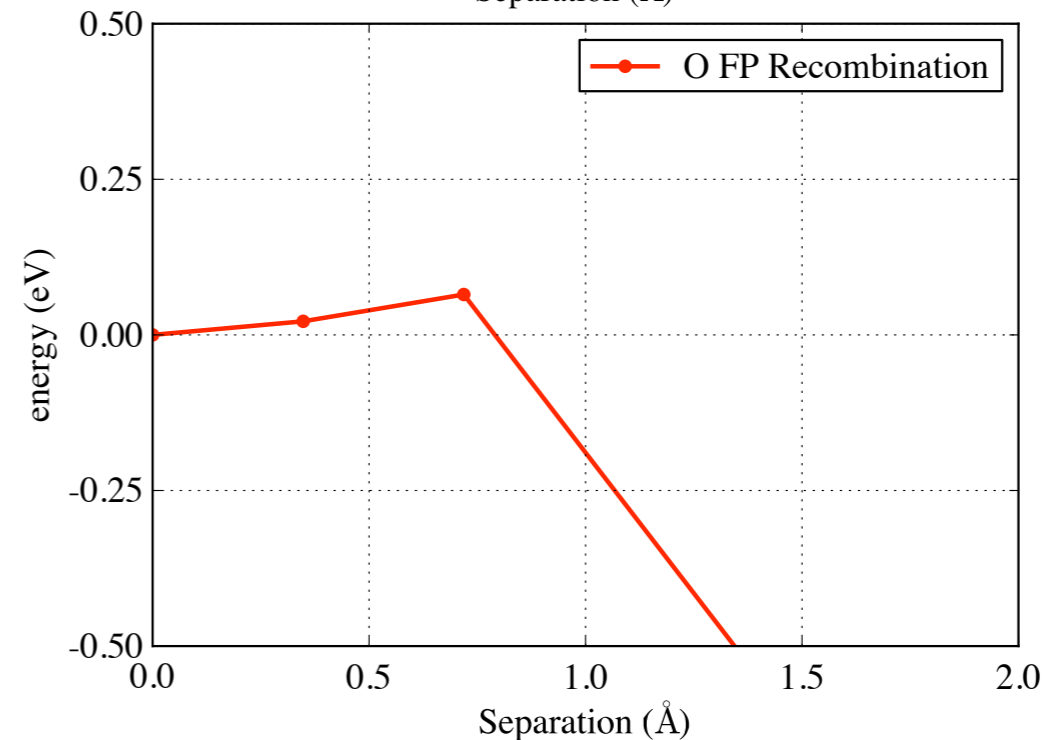
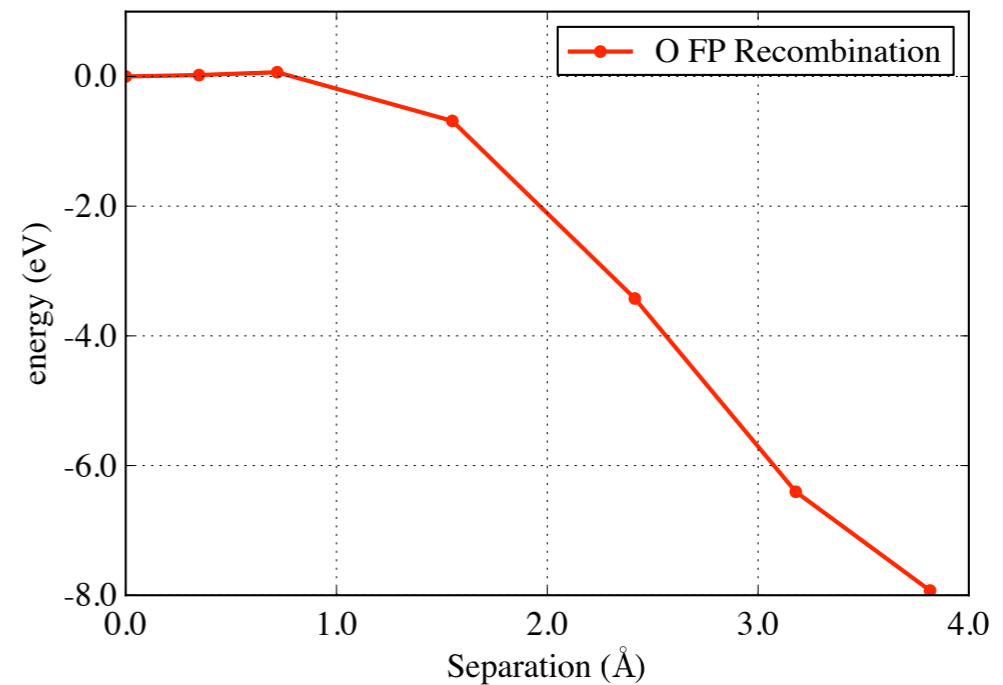
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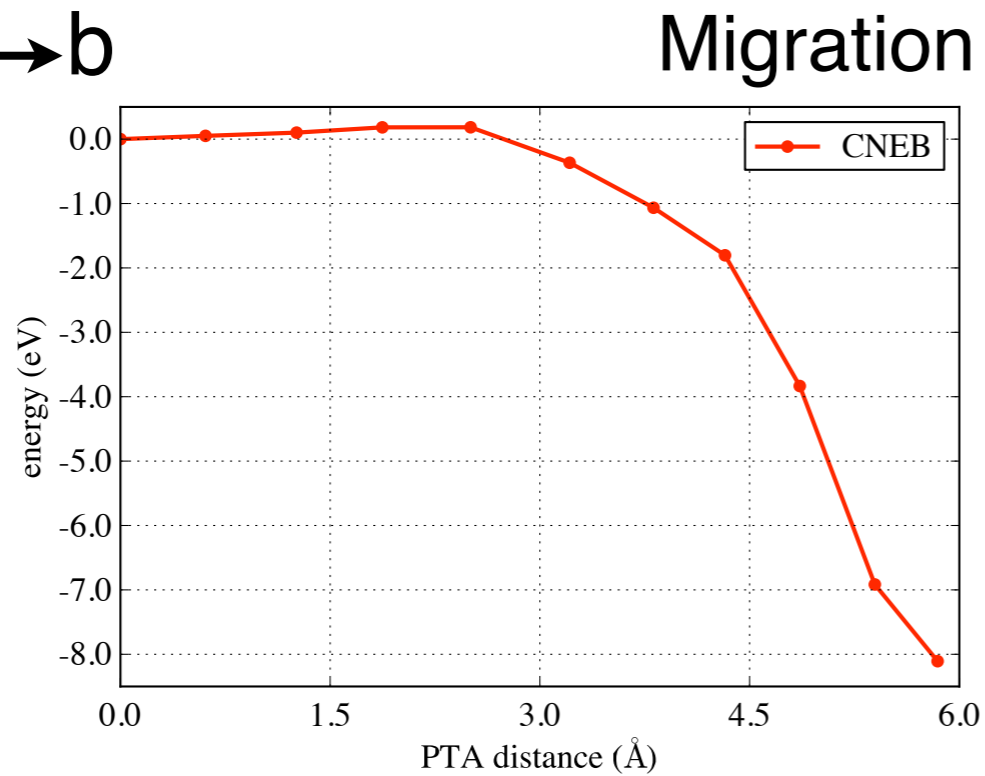


# Application - $TiO_2$

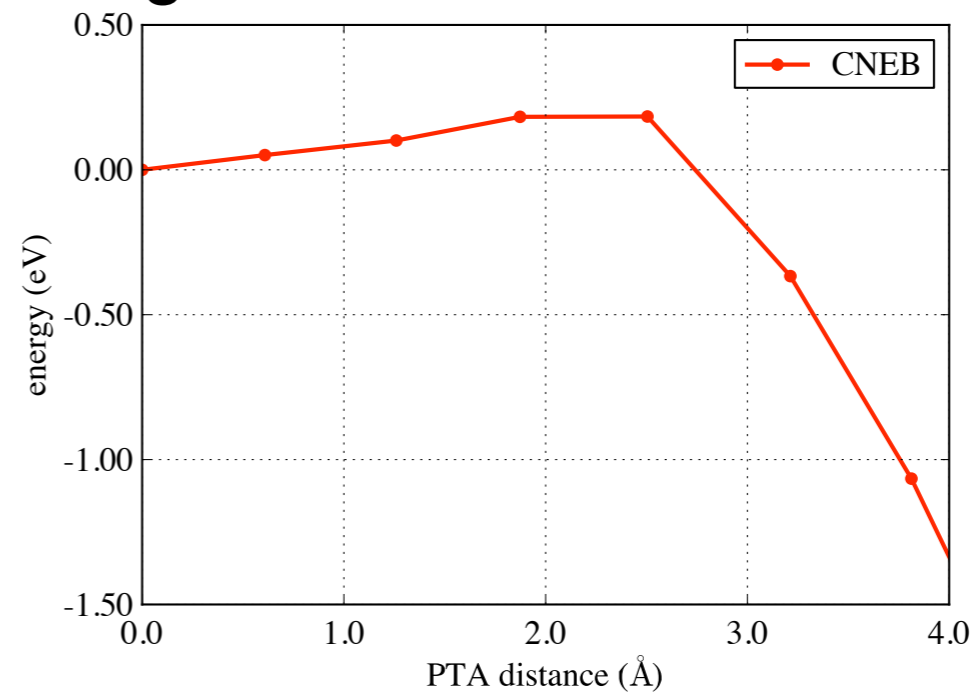
- ▶ O Frenkel pair annihilation - separation of around 6 Å.

6Å

c  
b



c  
b  
a



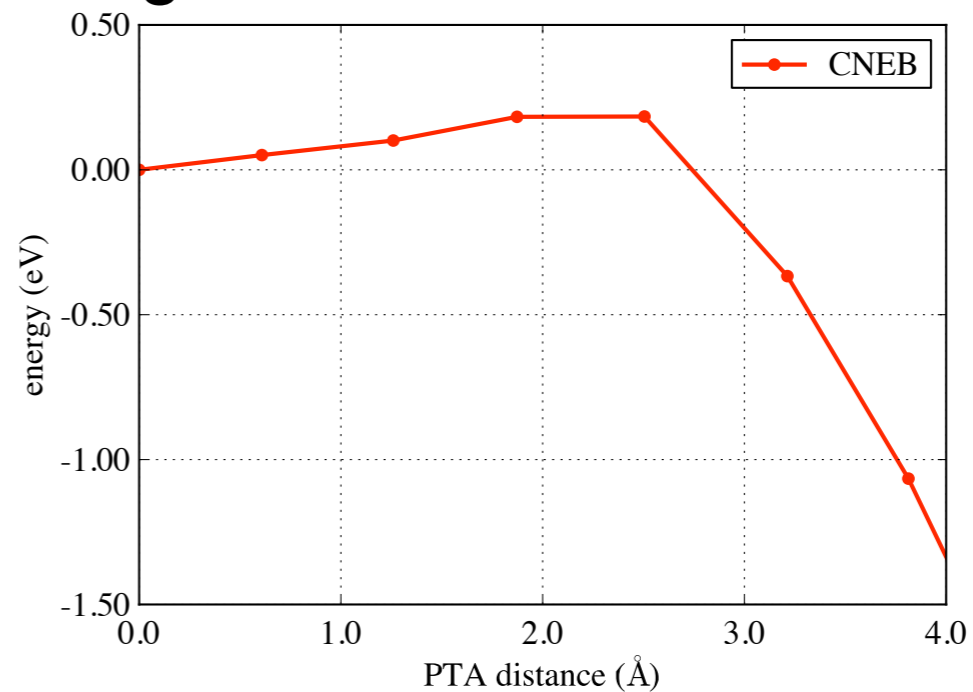
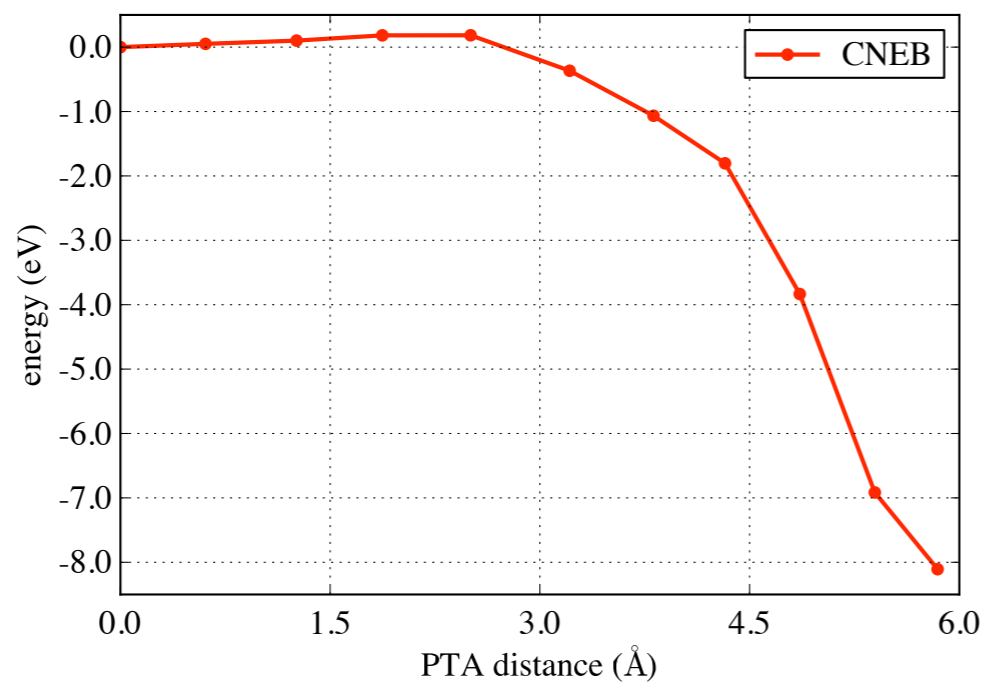
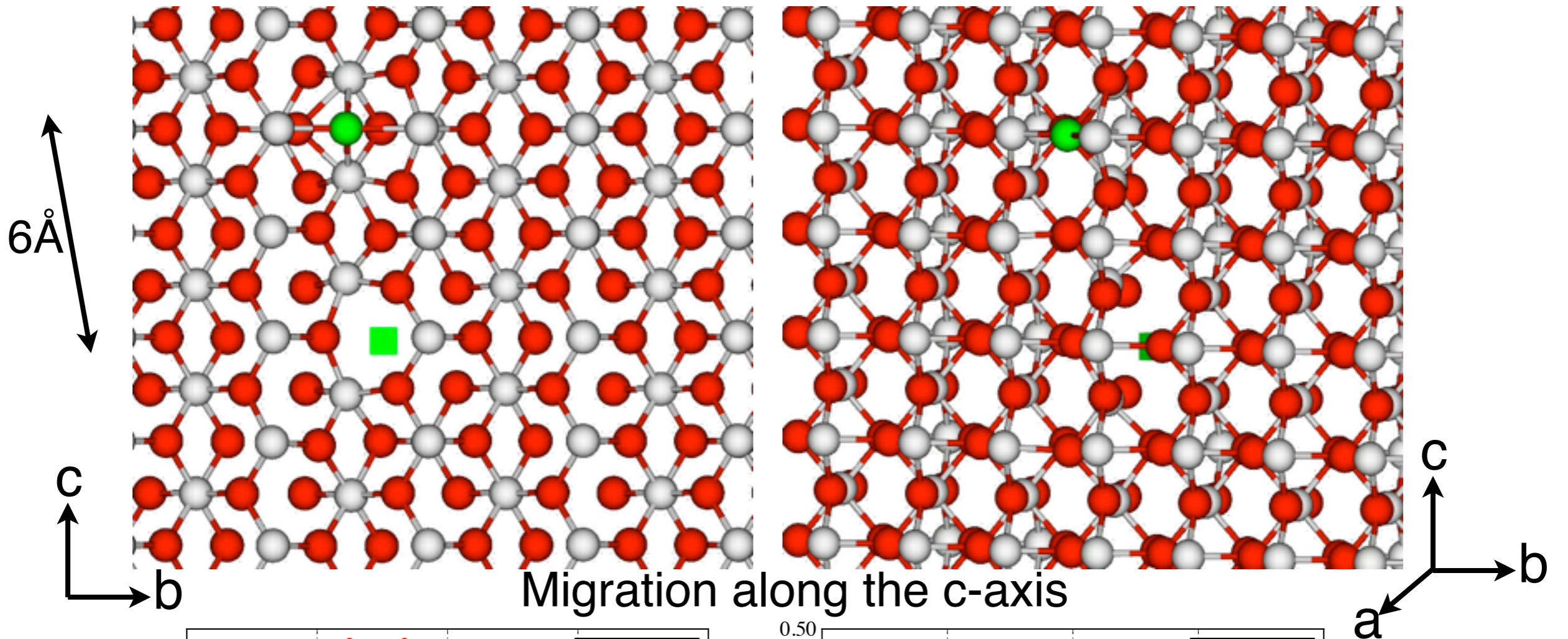
Single  
barrier  
process  
**0.18 eV**





# Application - $TiO_2$

- ▶ O Frenkel pair annihilation - separation of around 6 Å.



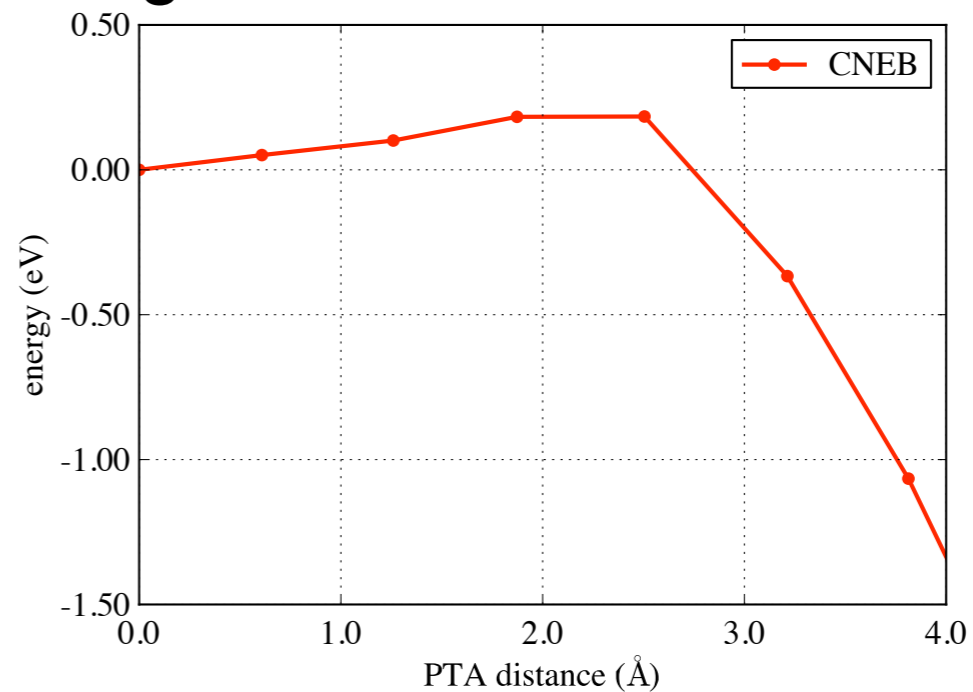
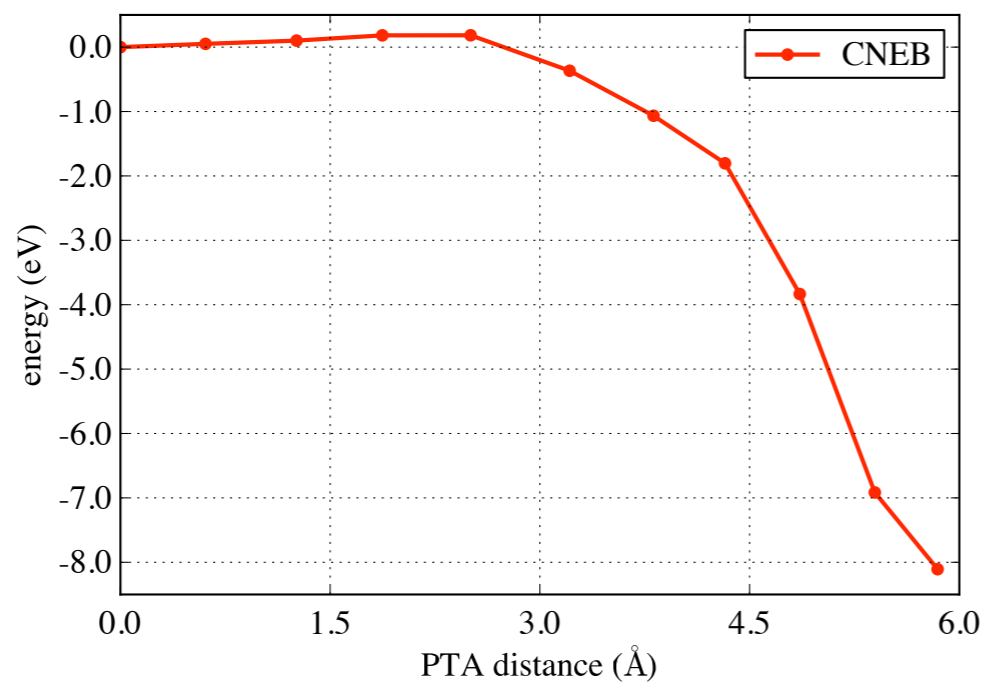
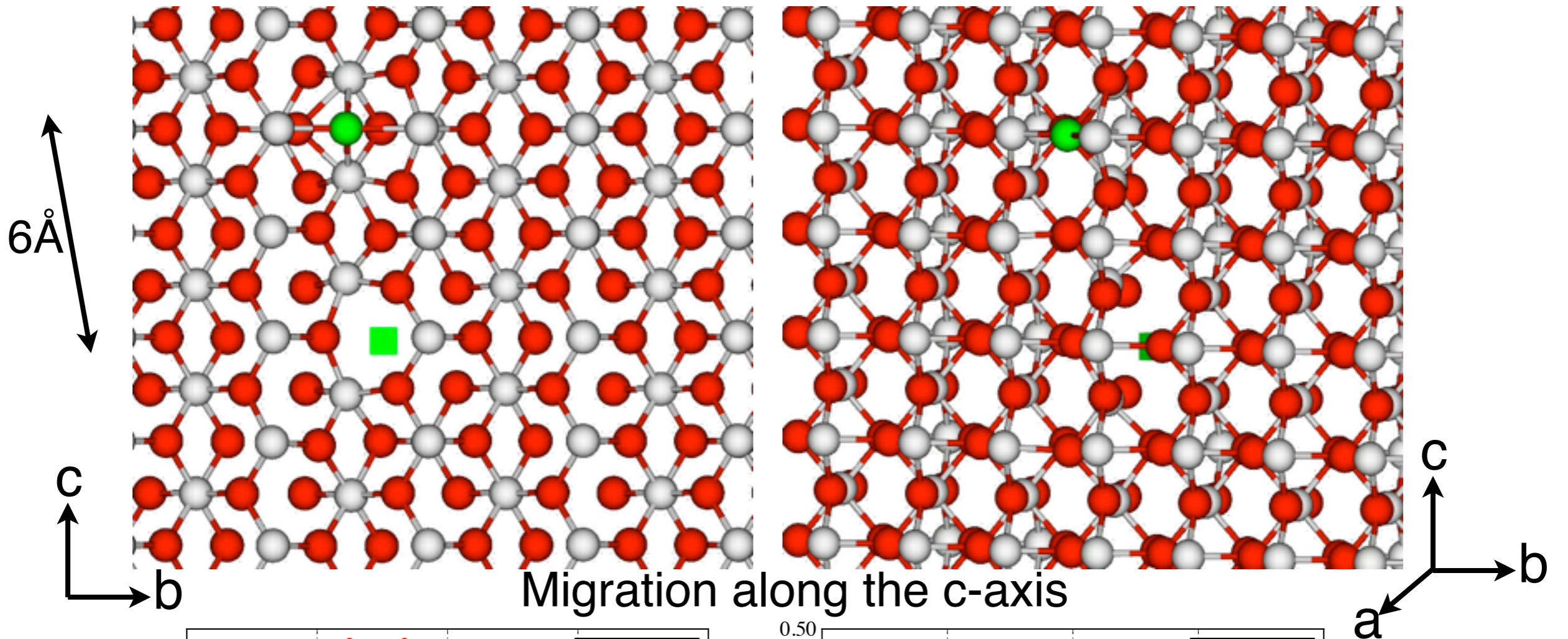
Single  
barrier  
process  
**0.18 eV**





# Application - $TiO_2$

- ▶ O Frenkel pair annihilation - separation of around 6 Å.



Single  
barrier  
process  
**0.18 eV**

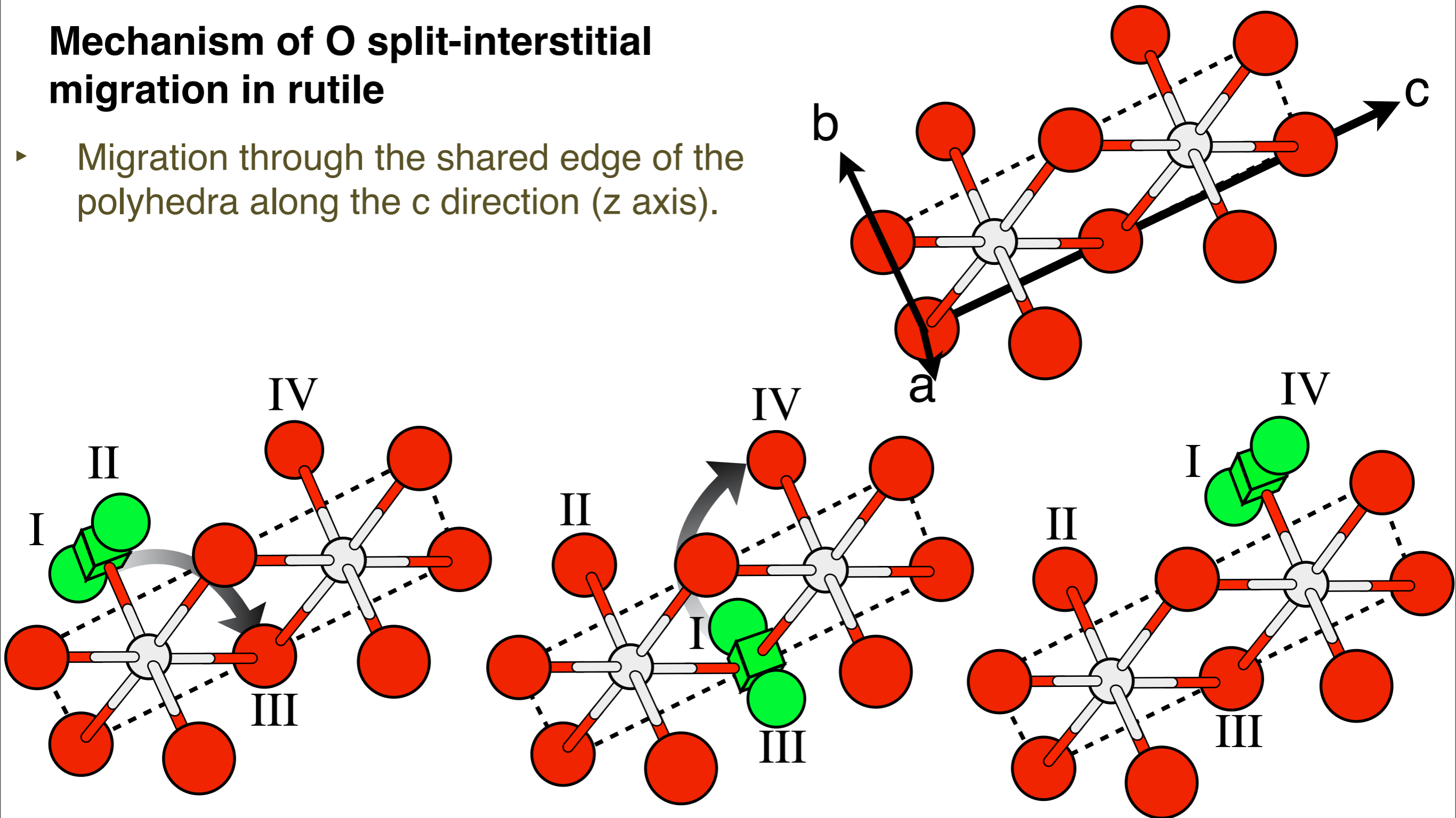




# Application - $TiO_2$

## Mechanism of O split-interstitial migration in rutile

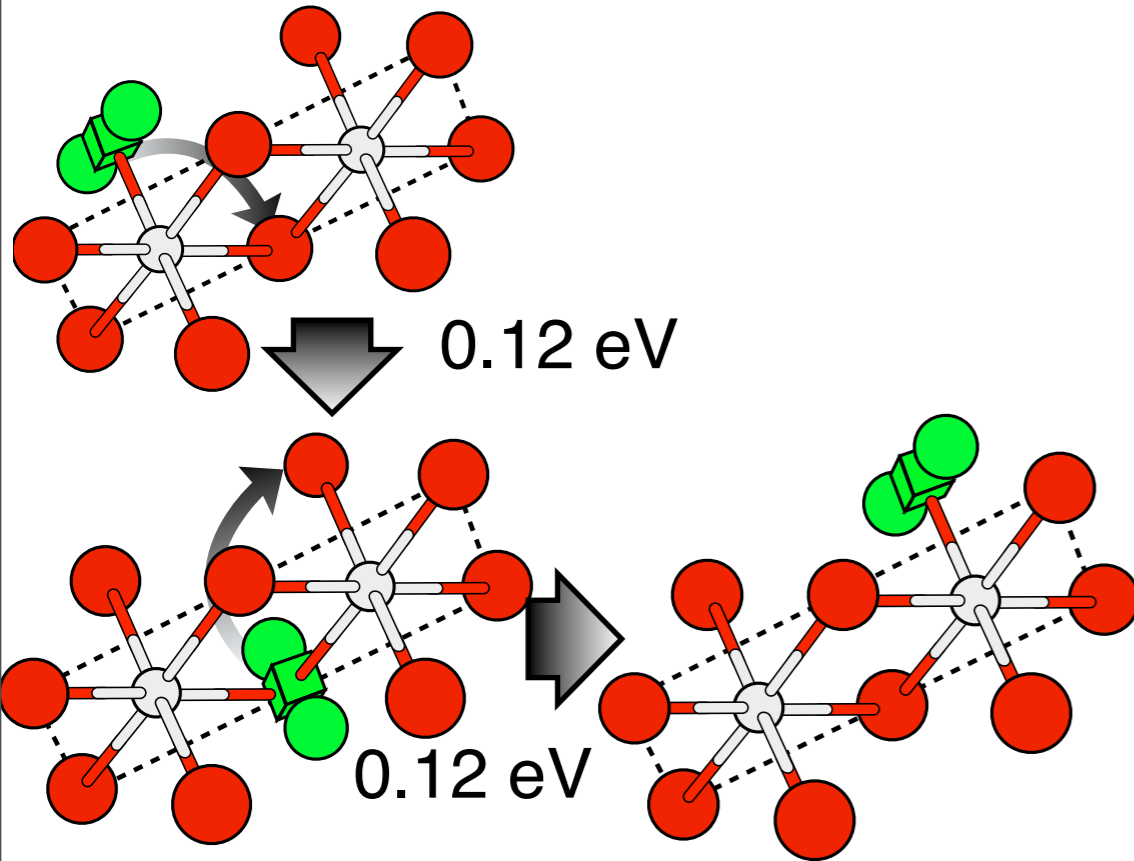
- Migration through the shared edge of the polyhedra along the c direction (z axis).



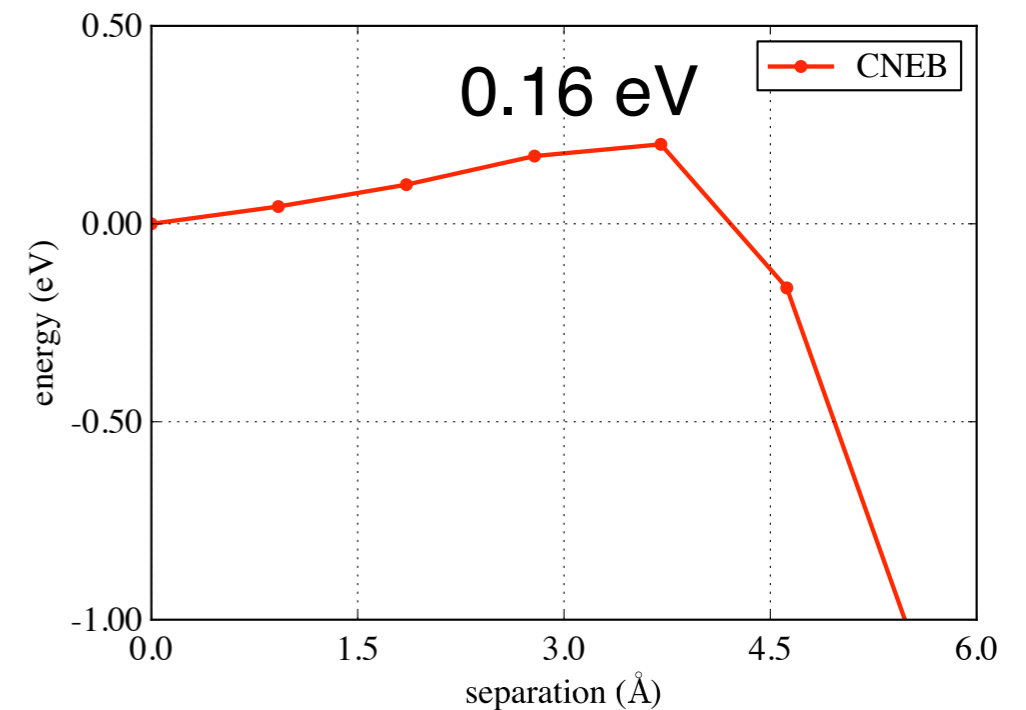
- TODO: Is this migration possible in anatase and brookite?**

# Application - $TiO_2$

- ▶ In bulk the transition is a **two stage process** with barriers around 0.12 eV.

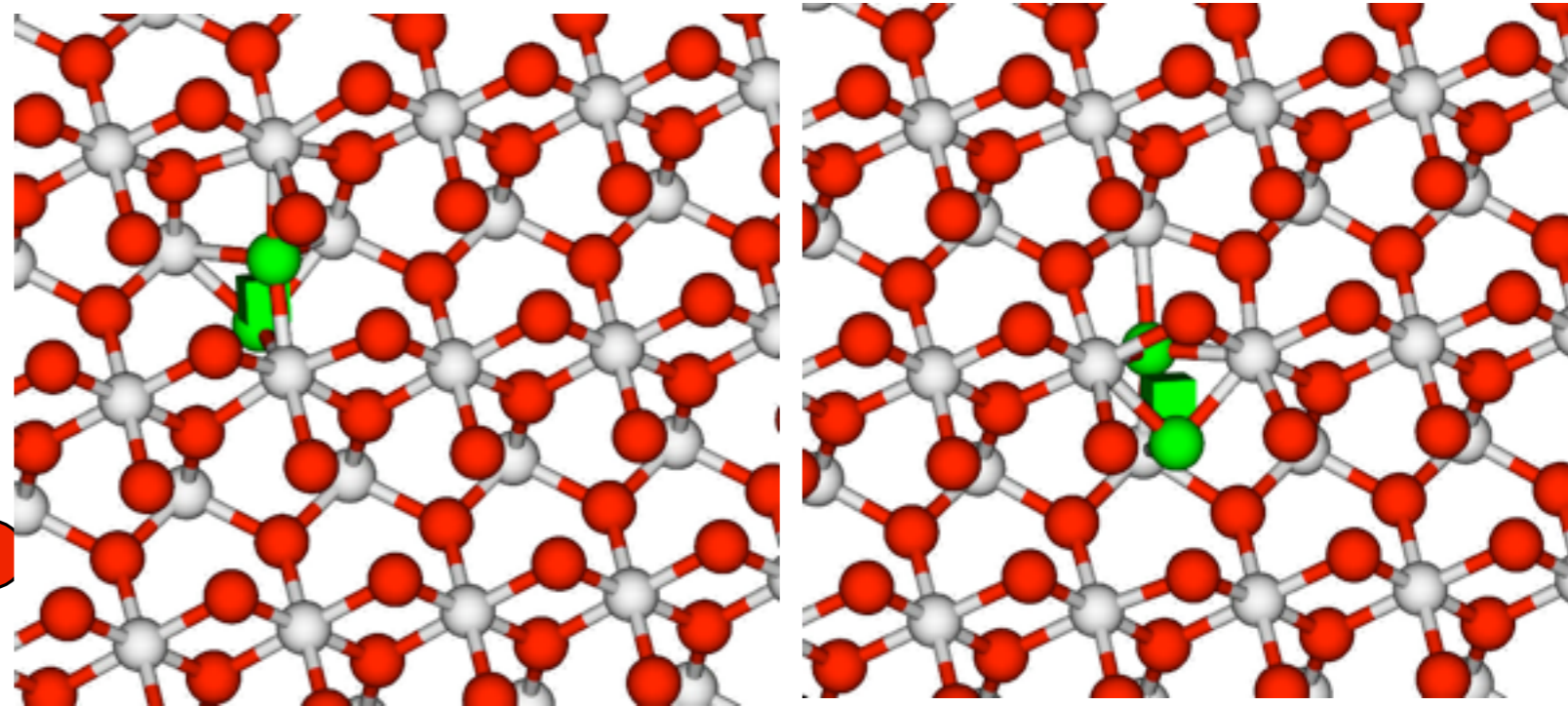
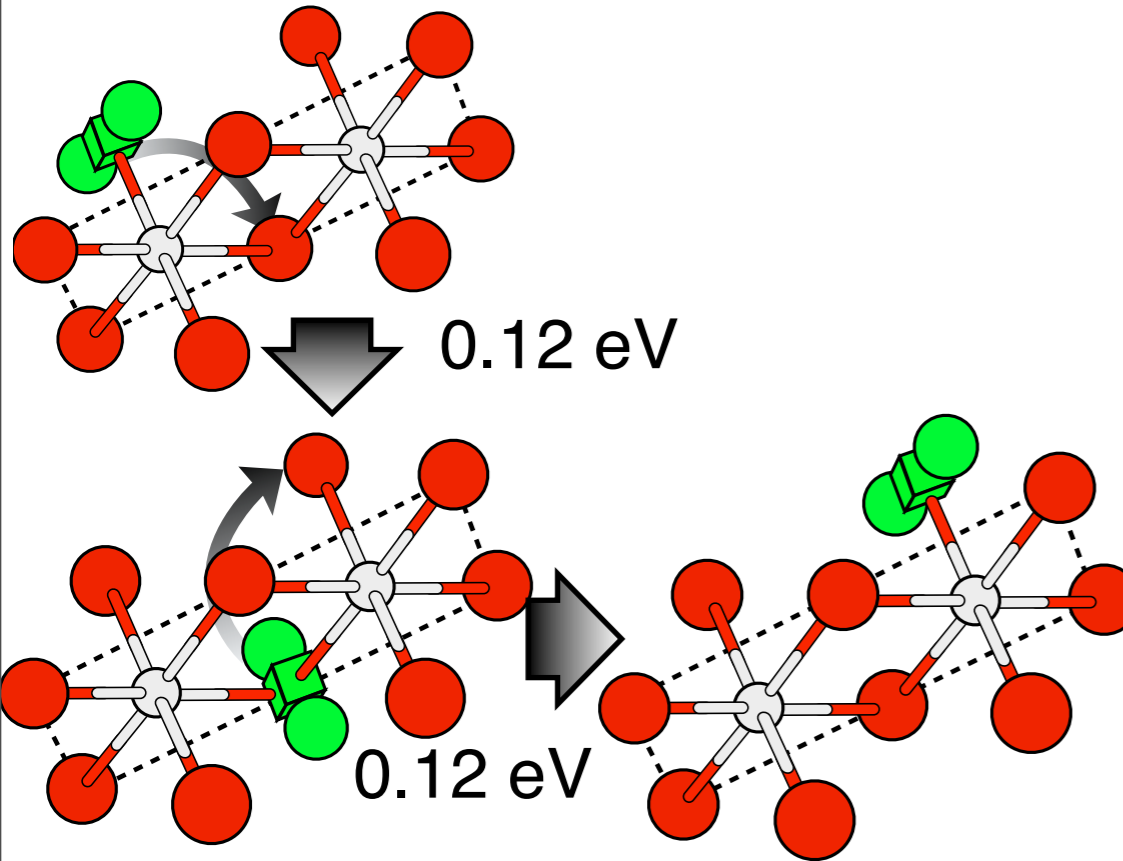


- ▶ In the presence of a local vacancy, the mechanism has a very low single barrier for annihilation.

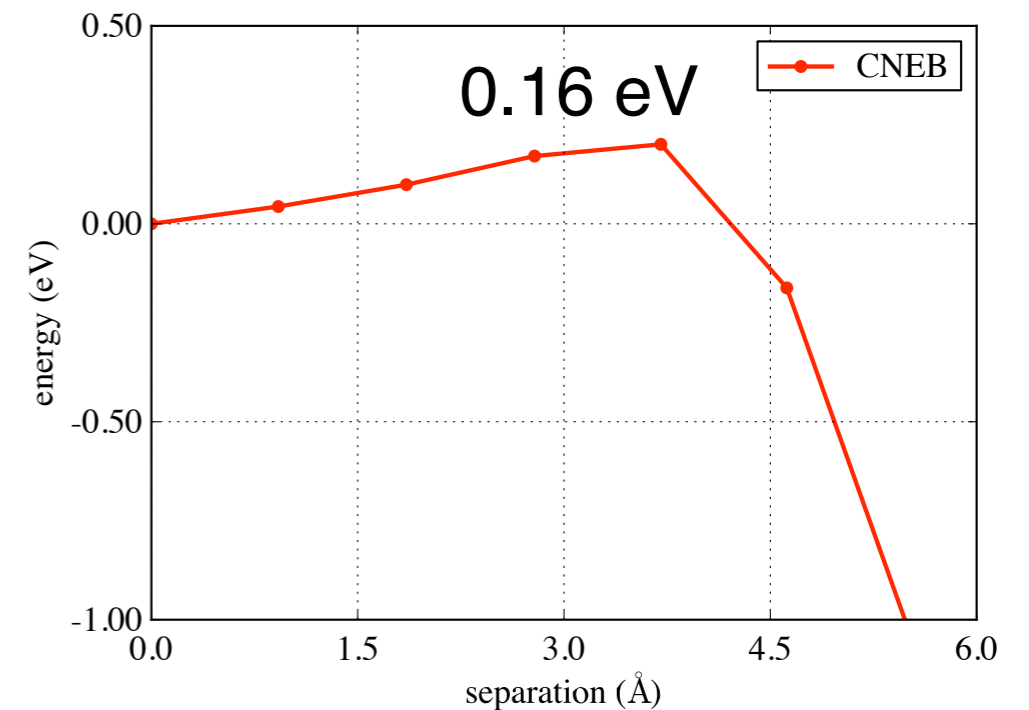
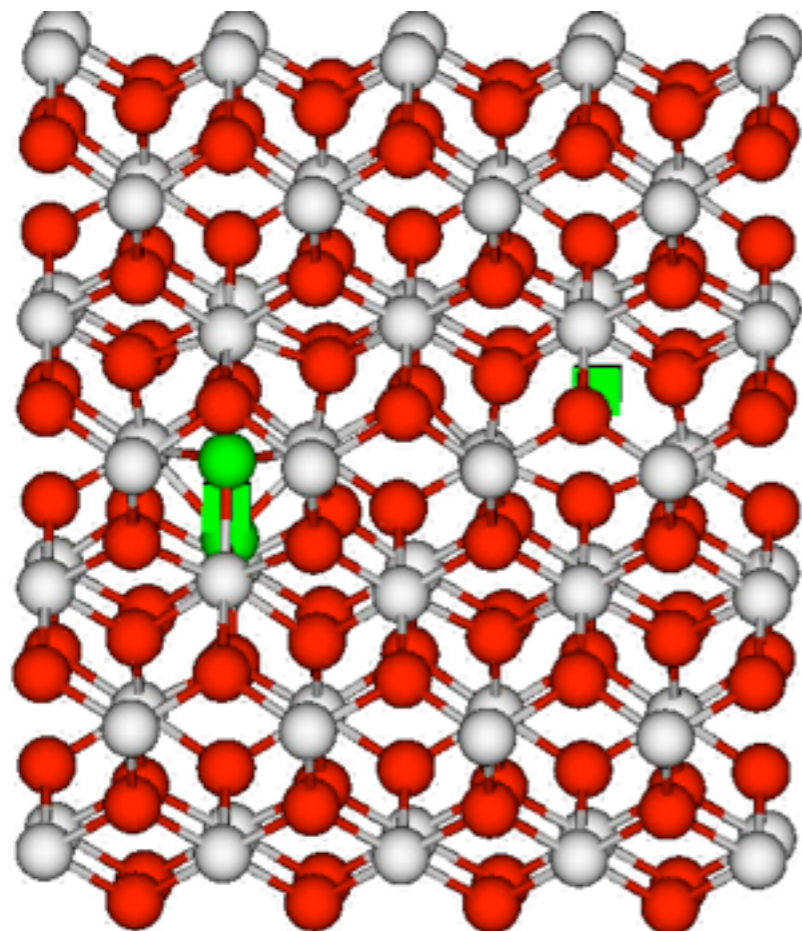


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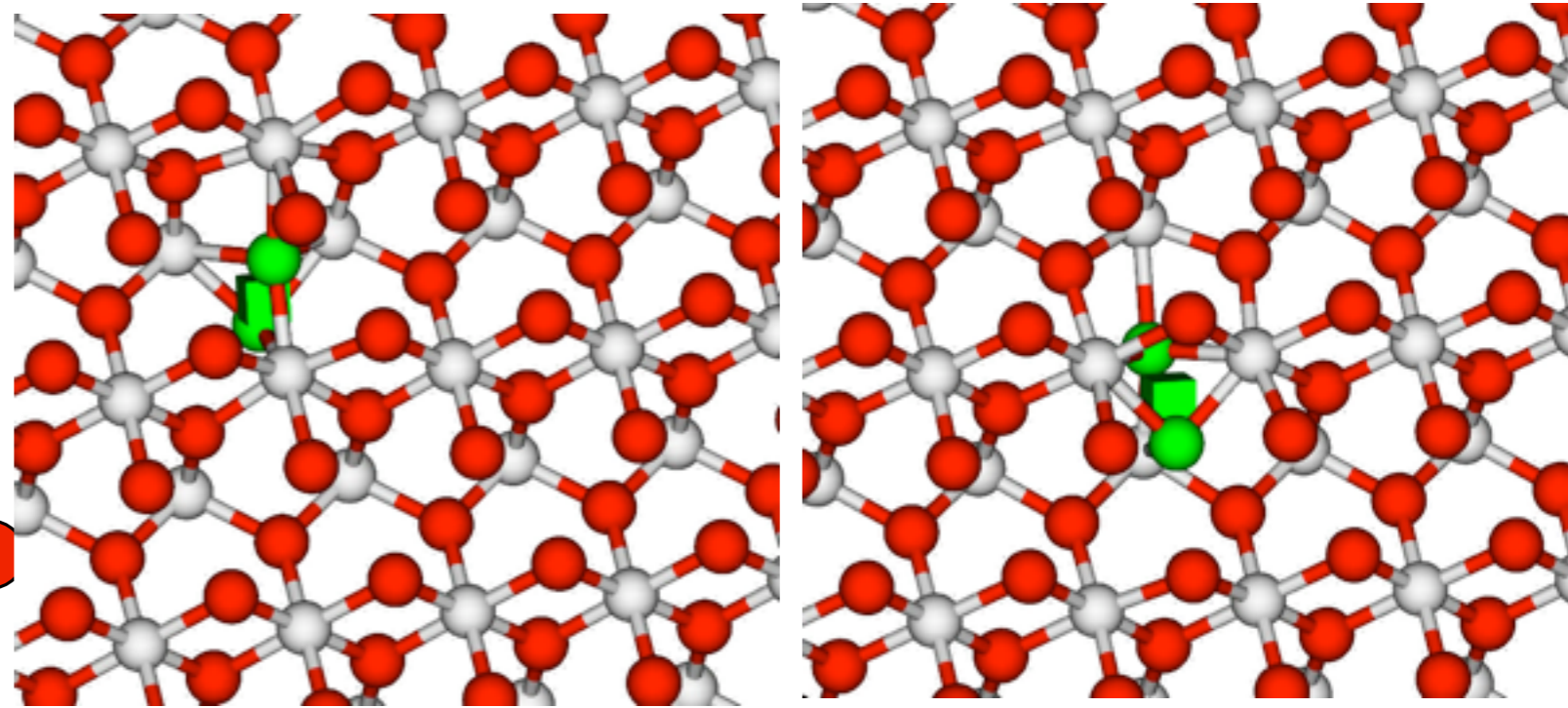
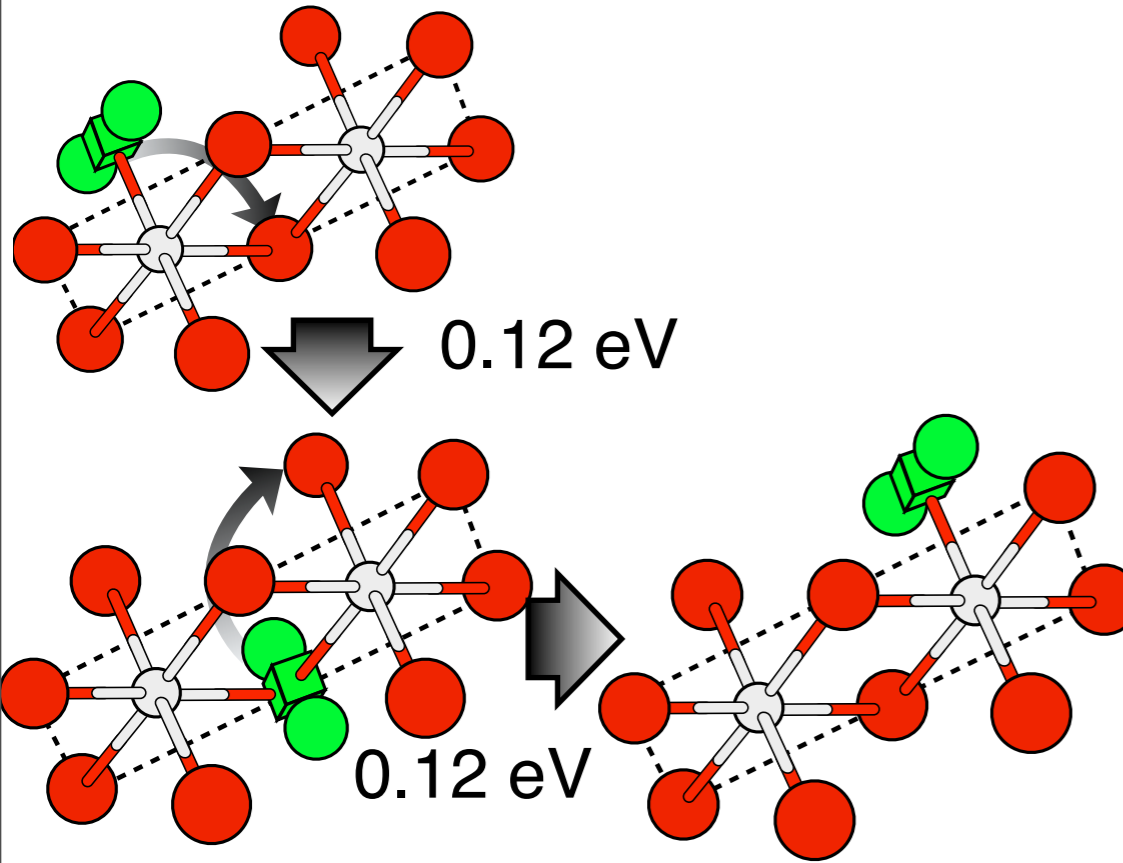
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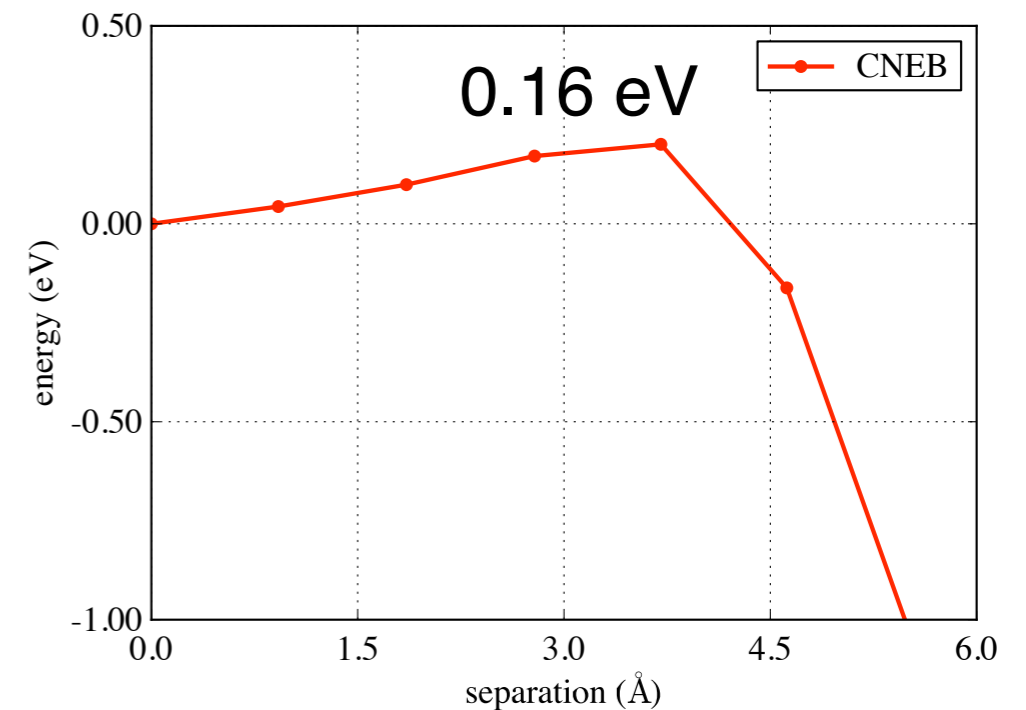
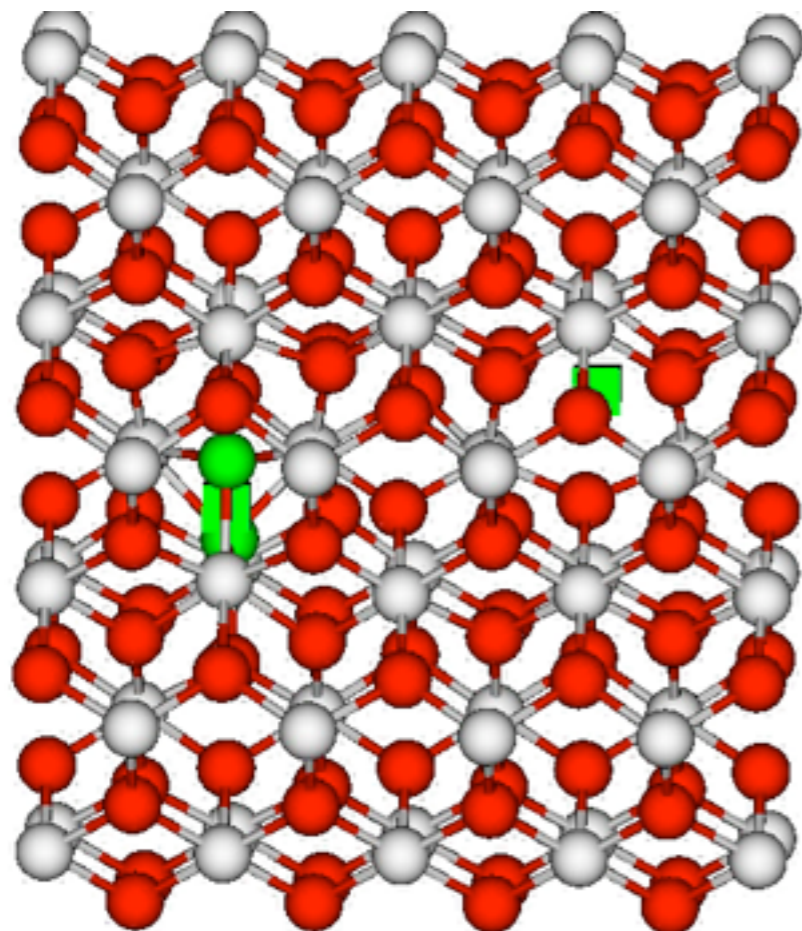


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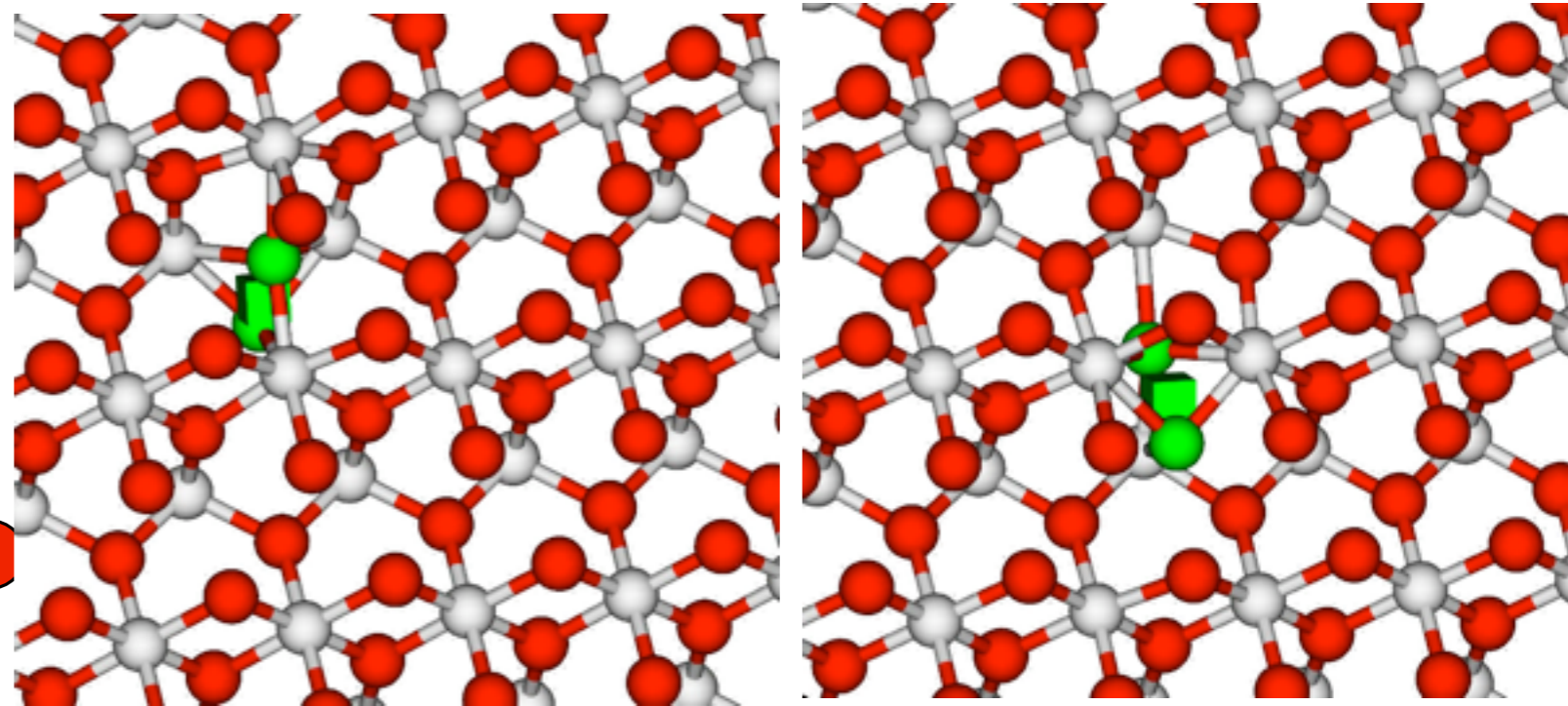
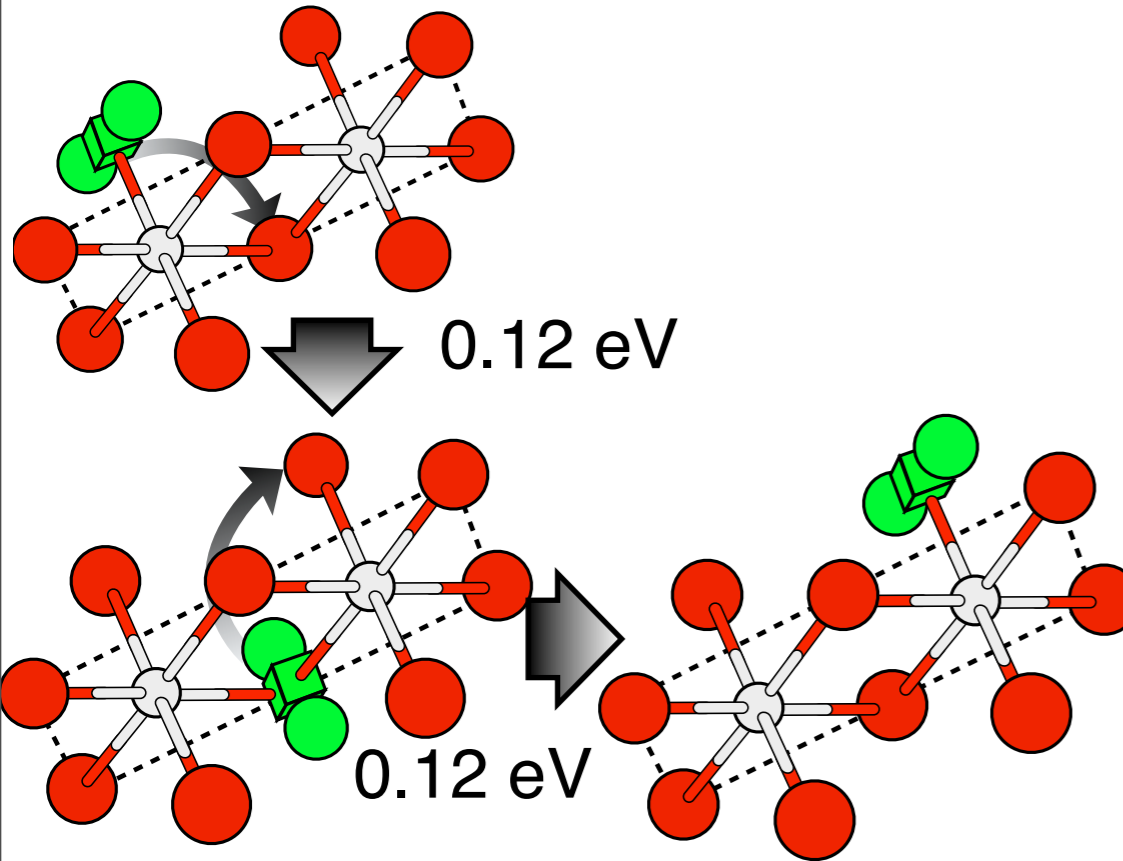
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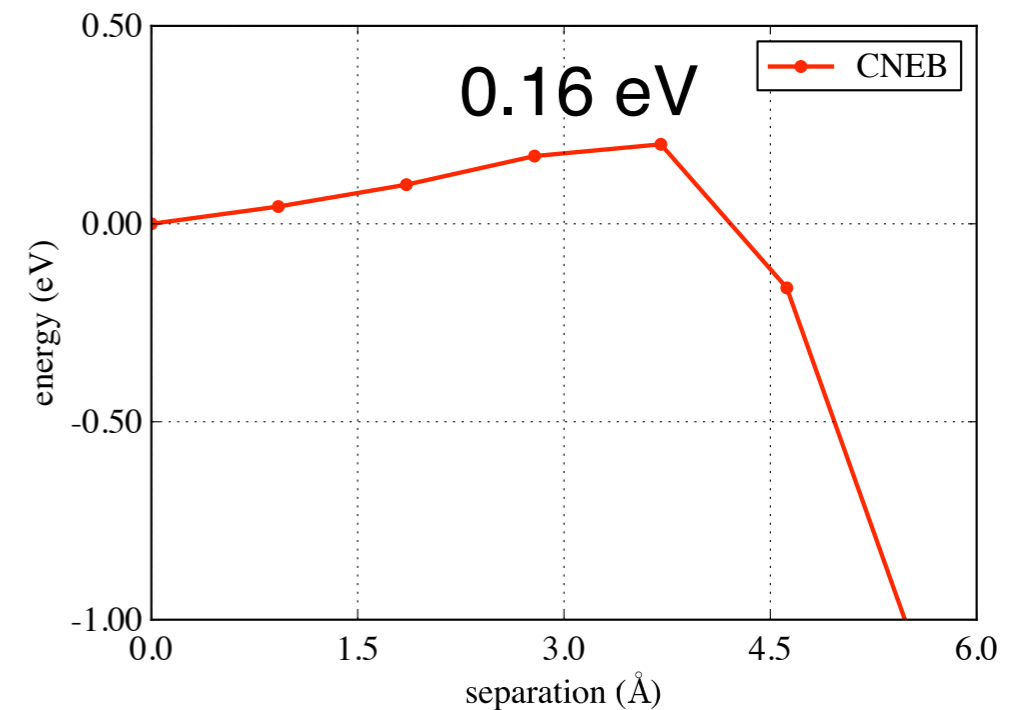
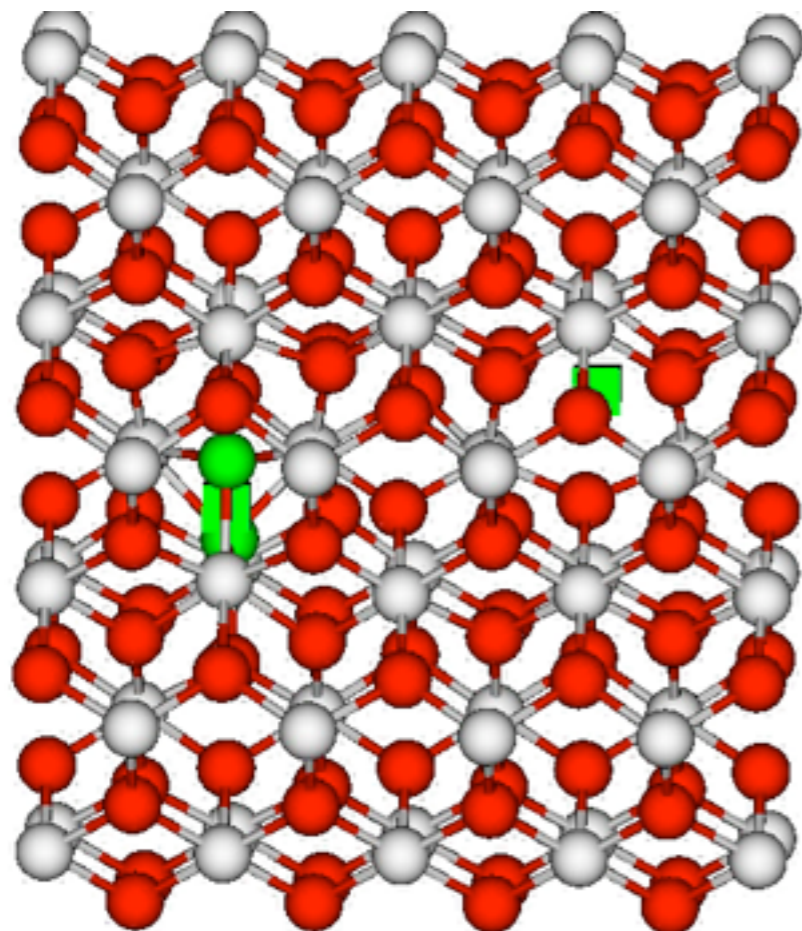


# Application - $TiO_2$

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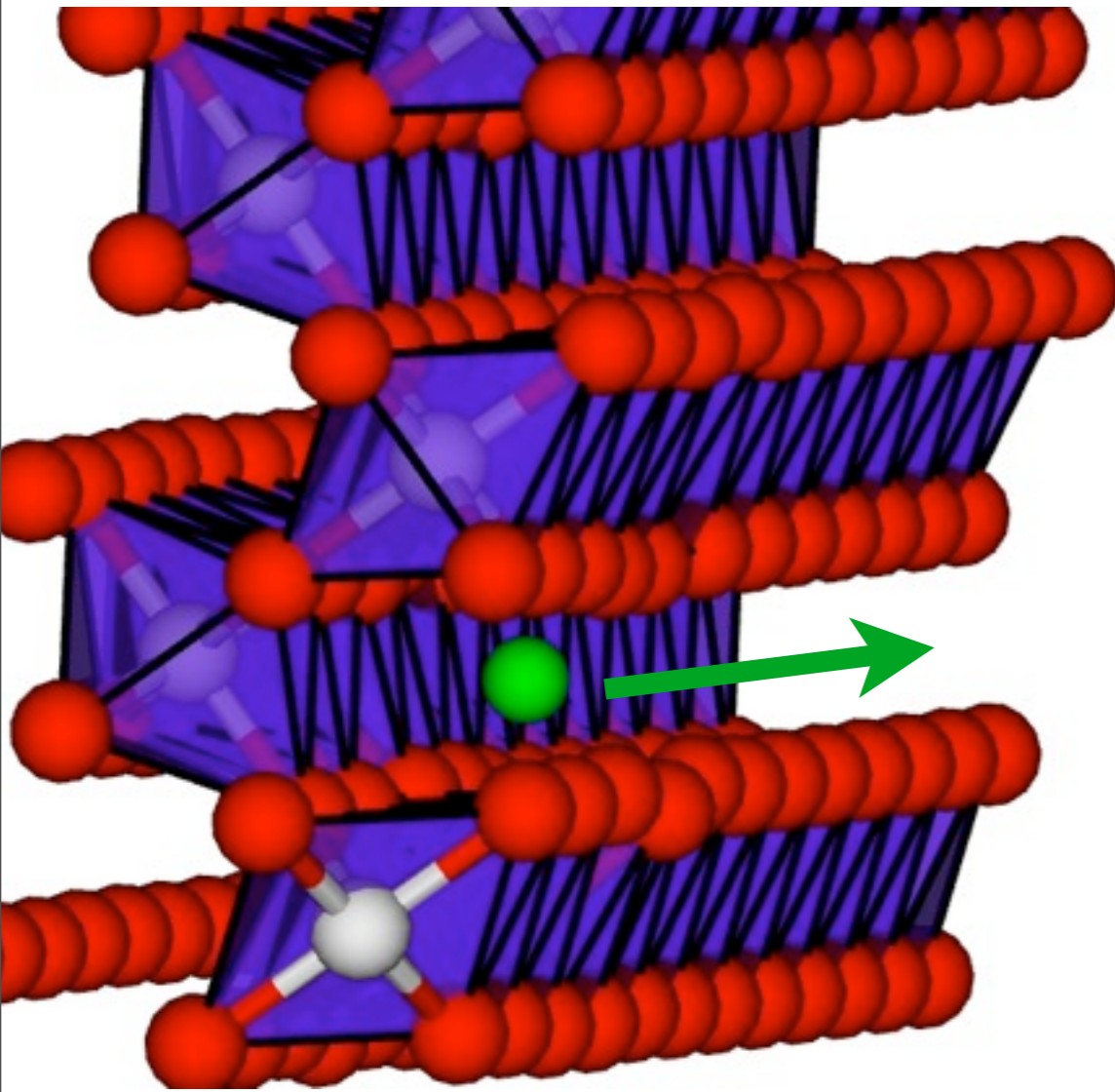
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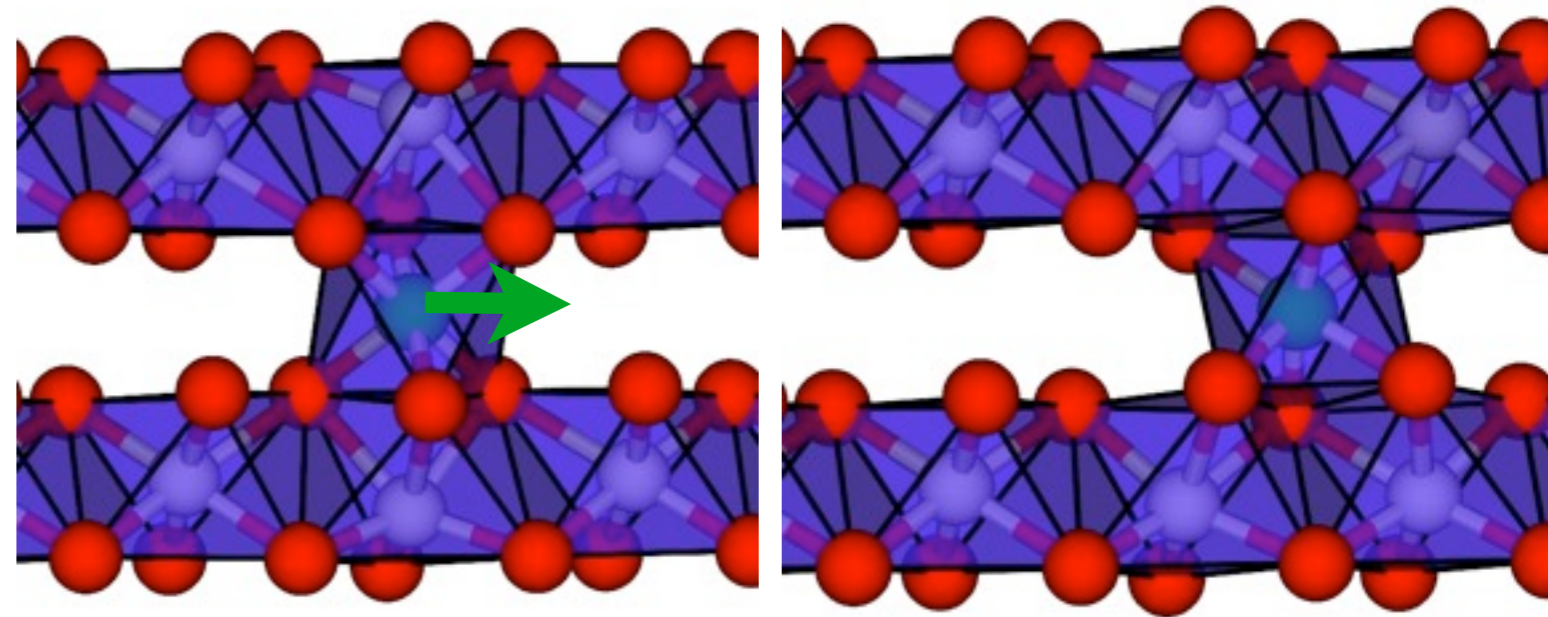


# Application - $TiO_2$

- In contrast, Ti octahedral interstitials migrate at much higher barrier down the Z-axis channels.



- ▶ Migration passes through 2 symmetrically equivalent octahedral sites with a barrier of **0.85 eV**



- Unlike the O split-interstitials that migrate through a concerted motion, the mechanism for the Ti interstitial is a simple linear transition.

# Application - $TiO_2$

- **Current conclusions:**
  - **Ballistic phase - Displacement threshold energy**
    - Reiterates the probabilistic nature of defect formation at low energy
    - O values of  $E_d$  were found to be lower than experimental, but can be attributed to low energy recombination barriers.
  - **Ballistic phase - Quantitative defect cluster analysis**
    - Different response from each sublattice, O PKA generates strictly O defects, Ti PKA produces a multitude of defects
    - Representative defect proportions useful for future long time scale simulations
  - **Recovery phase - Transition barriers / Diffusion mechanisms**
    - Relatively long range and low barrier O FP recombination transitions.
    - O split-interstitial migration along the rutile c-axis, with very low energy barriers.
- **TODO:**
  - ▶ The effect of the connectivity of the  $TiO_6$  polyhedra on defect migration:
    - Is migration impeded by change from edge to corner sharing?
    - Is the presence of the z-axis channel in rutile the main factor behind its increase in tolerance ?
  - ▶ Full scale OTF-KMC in each polymorph on the resultant defect clusters - particularly the di-vacancies and di-interstitials.



# Requirements for Future Work

- A **robust method** of accessing time-scales beyond MD.
  - ▶ Automated
  - ▶ Handle multiple complex defect structures
  - ▶ Highly disordered lattices
  - ▶ Large systems (as PKA energy increases)

*Thanks to ...*

