

# Modeling Hydrogen Metal Interactions

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# Outline

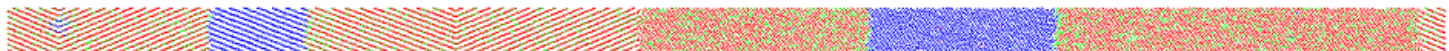
Hydrogen-metal interaction impacts a variety of material problems including hydrogen storage, hydrogen embrittlement, tritium science, etc. Molecular dynamics is effective in studying these problems. Here discuss three topics:

- Molecular dynamics studies of grain boundary and irradiation effects on hydrogen diffusion in nickel
- Development of Fe-Ni-Cr interatomic potential
- Quantification and reduction of statistical uncertainties in molecular dynamics models



# Grain Boundary and Irradiation effects on Hydrogen Diffusion in Nickel

- The TMIST-2 irradiation experiment at the Advanced Test Reactor at Idaho National Laboratory measured a tritium permeation enhancement in 316 stainless steel by a factor of  $\sim 2$  to 5 relative to ex-reactor results
- Grain boundaries and irradiation-induced defects may be both responsible
- Statistics of diffusion cannot be captured by DFT calculations. Molecular dynamics (MD) simulations are required to understand this
- The literature stainless steel potential we found at the time was developed by Bonny et al, but their later version (MSMSE, 21, 85004, 2013) incorrectly predicts phase separation



- We therefore use Ni as an exemplar to perform extensive MD simulations on hydrogen diffusion in Ni to elucidate the tritium permeation enhancement in 316 stainless steels



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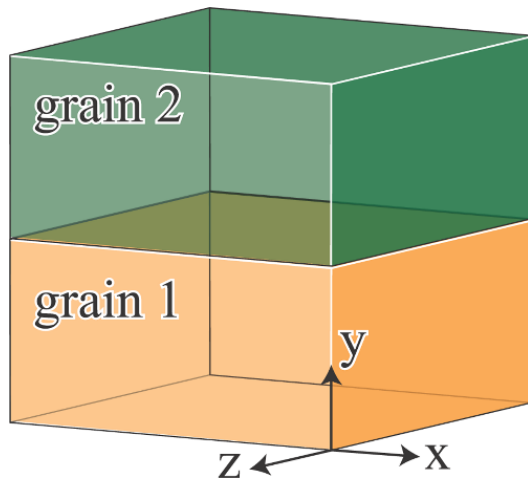




# Molecular Dynamics Method



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- Grain boundaries parallel to xz plane are simulated with bi-crystals under periodic boundary conditions
- Single crystal and  $\Sigma 3\{111\}$ ,  $\Sigma 5\{100\}$ ,  $\Sigma 11\{311\}$  grain boundaries are studied
- Systems with and without point defects are both considered. Three different point defects (interstitials, vacancies, and Frenkel pairs) are independently simulated. Defect concentration is fixed at contain  $C_{\text{def}} = 0.5\%$
- Systems contain a hydrogen concentration of  $C_{\text{H}} = 2\%$
- Ni-H potential from Angelo et al, MSMSE, 3, 289, 1995
- MD simulations are performed at 13 temperatures 300 K, 325 K, ..., 575 K, 600 K for a period of  $t_{\text{MD}} = 440$  ns (after 1 ns pre-equilibration)

# Diffusion Analysis

- The coordinates  $\alpha_i(t)$  of  $N$  hydrogen atoms ( $i = 1, 2, \dots, N$ ), are recorded on a time interval of  $\Delta t$ , i.e., at times of  $t = j\Delta t$ ,  $j = 1, 2, \dots, m$  ( $m = t_{MD}/\Delta t$ ), where  $\Delta t$  can be any multiple of the time step size  $dt$  used in the MD simulations.
- $m+1-k$  measurements can be made for the displacement of a hydrogen atom  $i$  over a  $k\Delta t$  period:  $\Delta\alpha_{i,j}(k\Delta t) = \alpha_i(j\Delta t - \Delta t + k\Delta t) - \alpha_i(j\Delta t - \Delta t)$  where  $j = 1, 2, \dots, m+1-k$ .
- This allows us to calculate mean square displacement (MSD):

$$\langle [\Delta\alpha(k\Delta t)]^2 \rangle = \frac{\sum_{i=1}^N \sum_{j=1}^{m+1-k} [\Delta\alpha_{i,j}(k\Delta t)]^2}{N(m+1-k)}$$

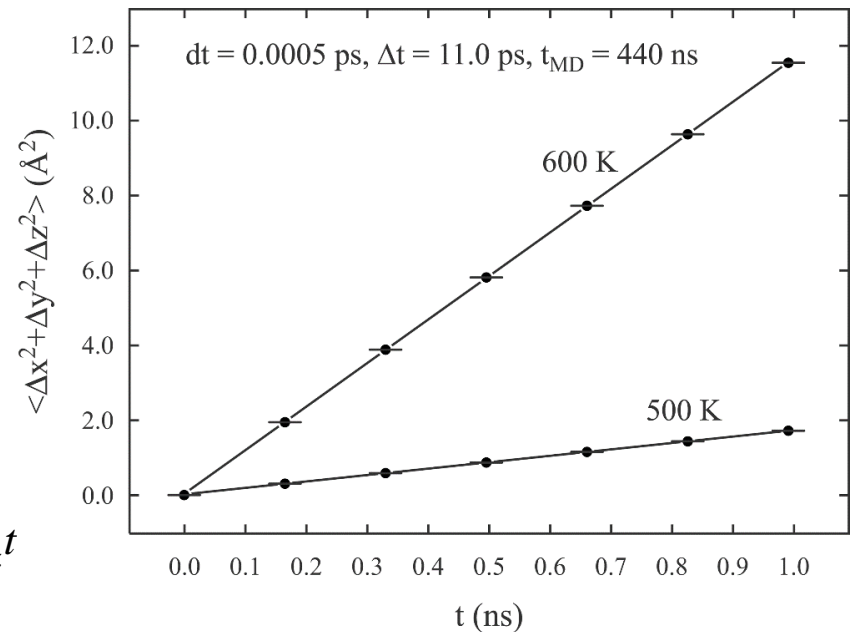
- MSD can be fitted to diffusivities  $D$ :

$$\langle [\Delta\alpha(k\Delta t)]^2 \rangle = 2D_{\alpha} t$$

$$\langle [\Delta x(k\Delta t)]^2 \rangle + \langle [\Delta z(k\Delta t)]^2 \rangle = 4D_{xz} t$$

$$\langle [\Delta x(k\Delta t)]^2 \rangle + \langle [\Delta y(k\Delta t)]^2 \rangle + \langle [\Delta z(k\Delta t)]^2 \rangle = 6D_{xyz} t$$

MSD convergence figure



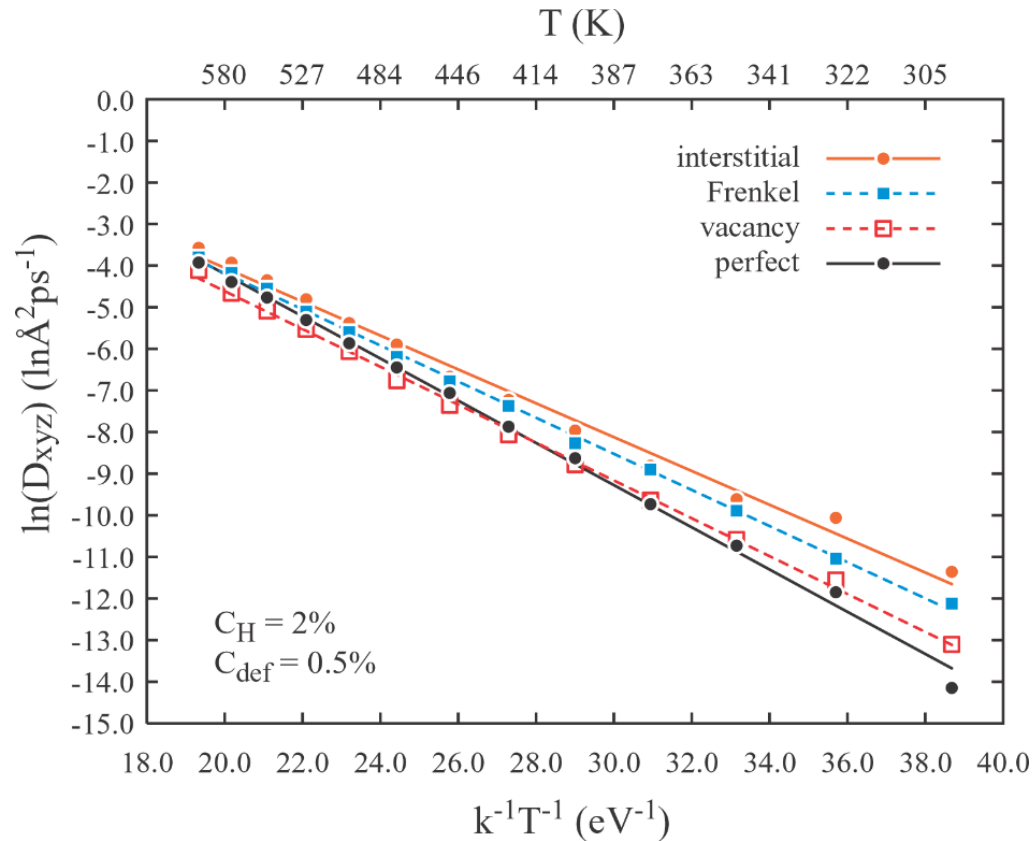
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# Defect Effects on H Diffusion in Ni Single Crystals

defects effects on xyz diffusion in  $\Sigma 1$  systems



- Diffusivities are close with and without vacancies
- At the simulated interstitial concentration of 0.5%, interstitial increases diffusivities by 16.3 times at 300 K and 1.4 times at 600 K as compared with perfect crystals
- Activation energy of diffusion for perfect crystals is predicted to be 0.51 eV, as compared to the experimental value of 0.40 eV\*

\*L. Katz, M. Guinan, and R. J. Borg, Phys. Rev. B, 4, 330 (1971)

**t = 440 ns**



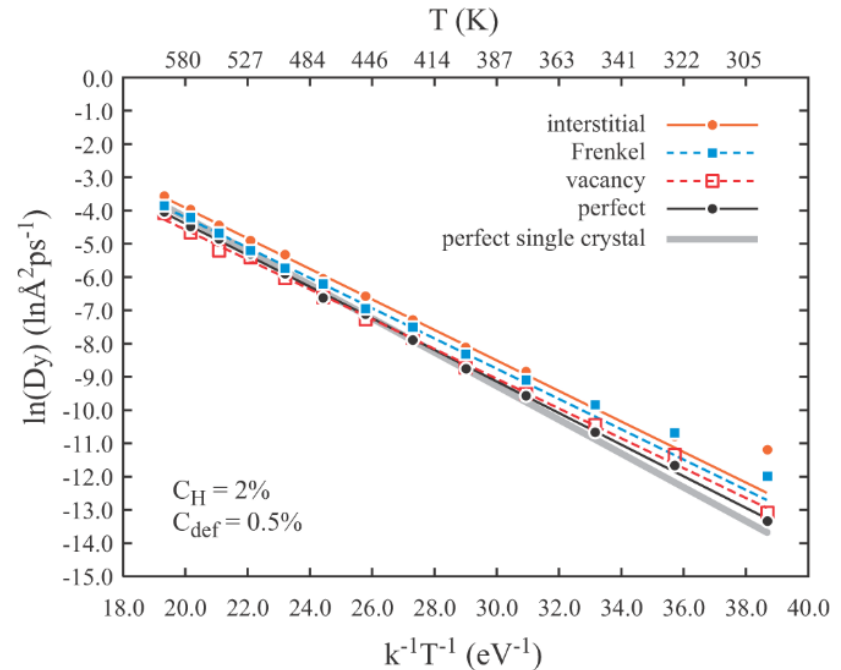
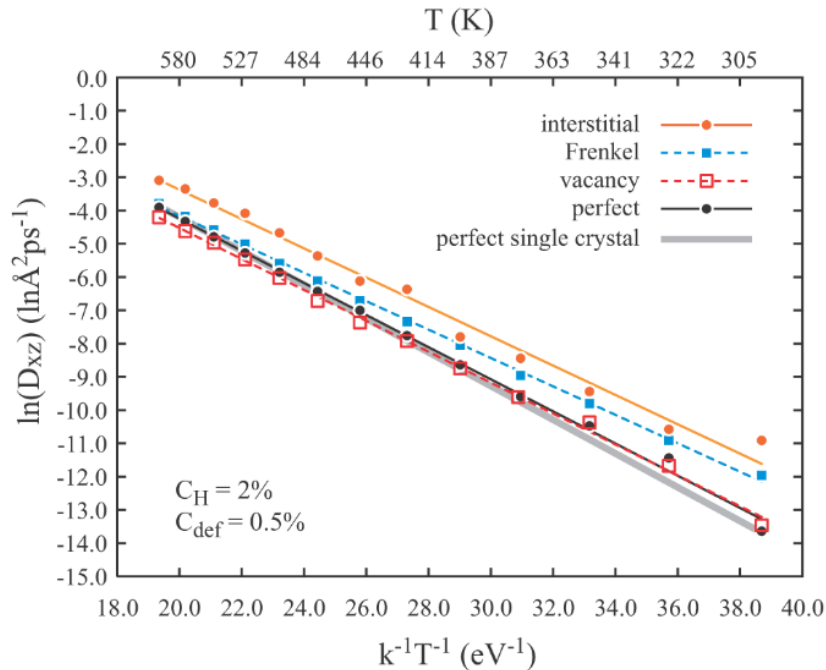
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# Defect Effects on H Diffusion in Ni with the $\Sigma 3\{111\}$ GB

(a) defect effects on xz diffusion in  $\Sigma 3\{111\}$  systems

(b) defect effects on y diffusion in  $\Sigma 3\{111\}$  systems



- The coherent twin boundary almost has no effects on diffusivities with different defects except in the interstitial case
- Interstitial increases on-plane diffusivities by 15.3 times at 300 K and 2.3 times at 600 K as compared with perfect crystals
- Out-plane diffusivities are close to single crystals, indicating insignificant grain boundary trapping

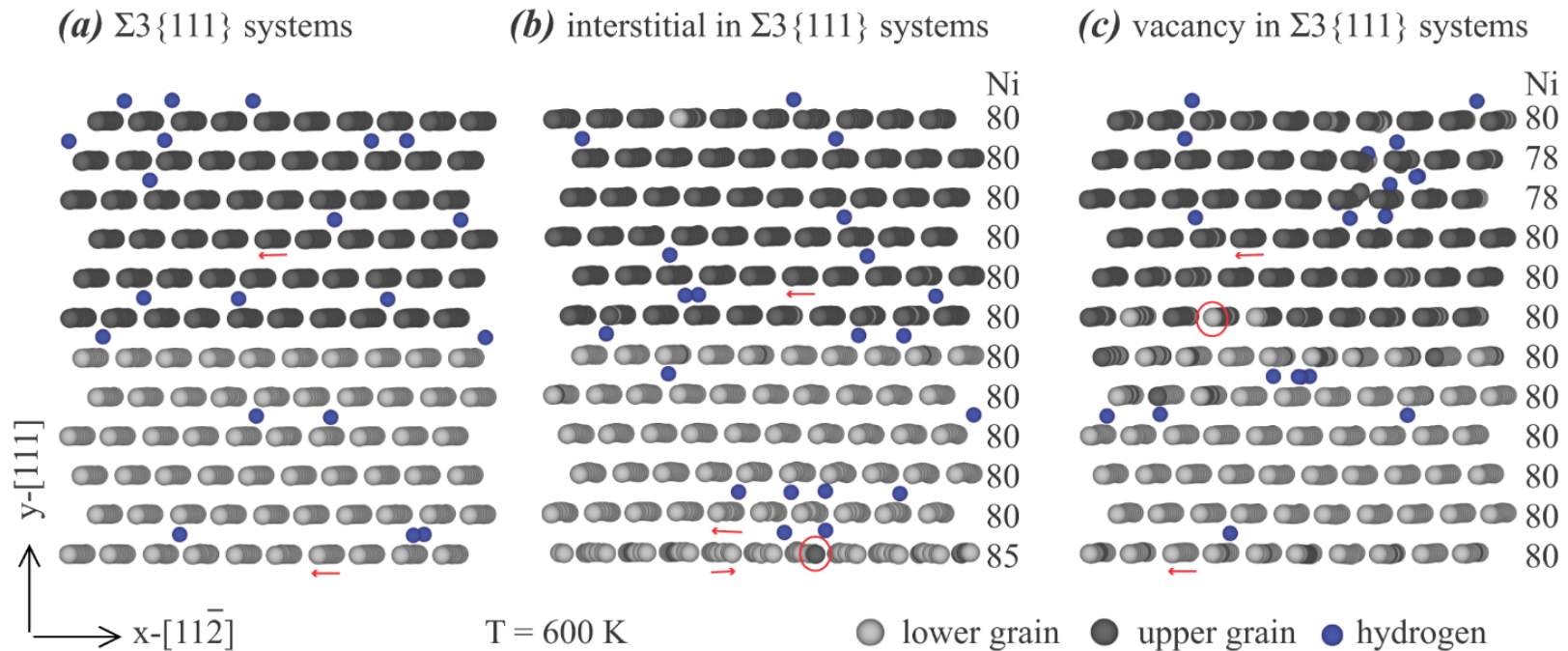
**t = 440 ns**



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$$\begin{aligned} C_H &= 2\% \\ C_{\text{def}} &= 0.5\% \end{aligned}$$


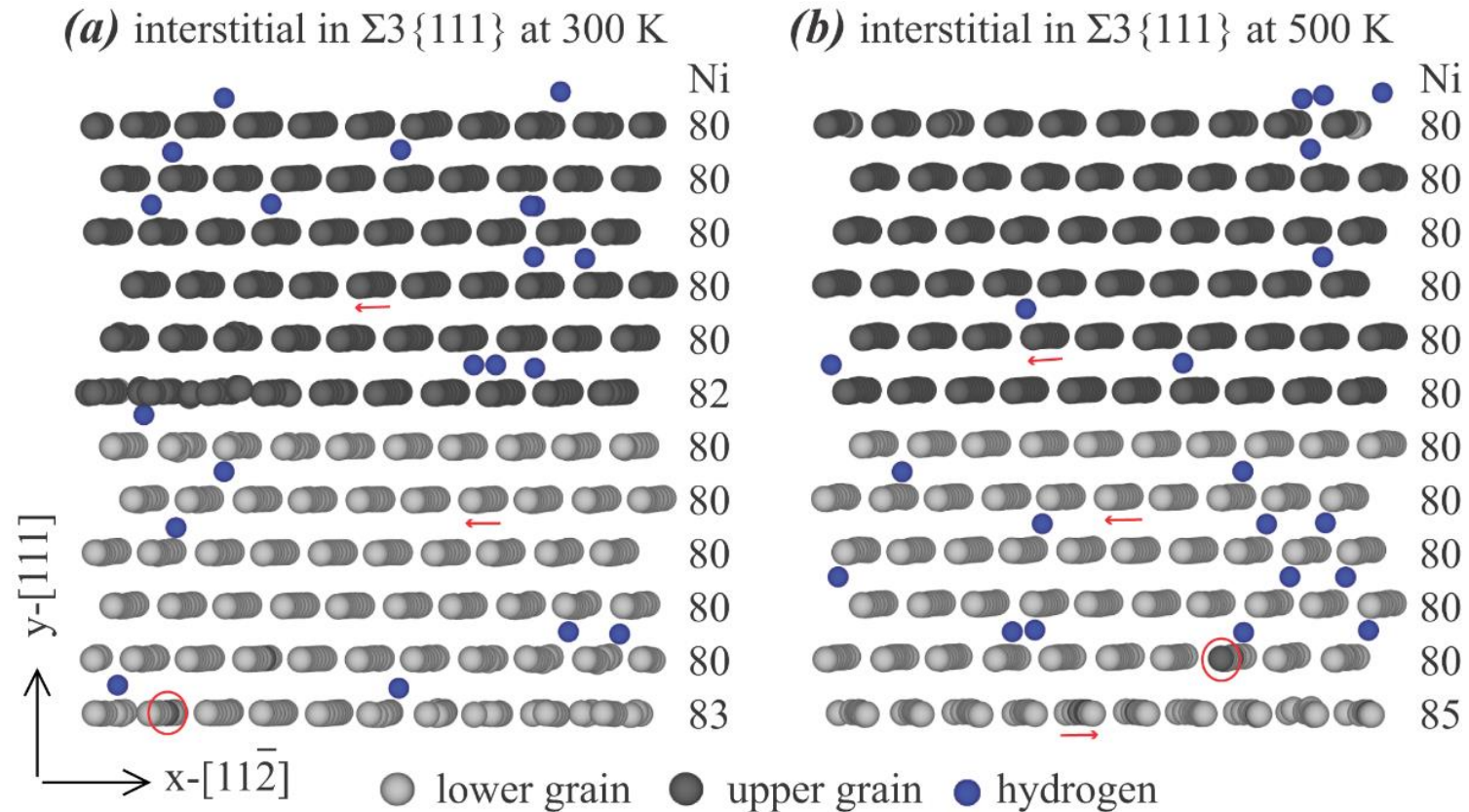
- Hydrogen does not segregate, but Ni interstitials and vacancies segregate at grain boundary
- Ni diffusion only occurs at the presence of interstitials and vacancies
- Interstitials cause reconstructions of atomic rows



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# Observation of Two $\Sigma 3\{111\}$ Grain Boundary Reconstructions due to Interstitials



- The 300 K reconstruction is similar to the one shown above, but the atomic rows in the 500 K reconstruction are different

$$C_H = 2\%,$$

$$C_{\text{def}} = 0.5\%$$

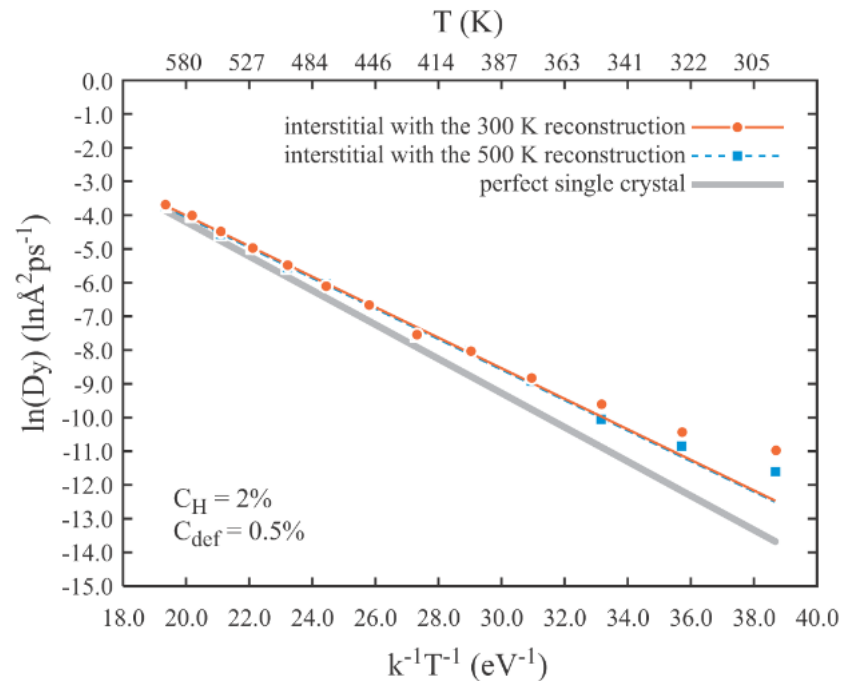
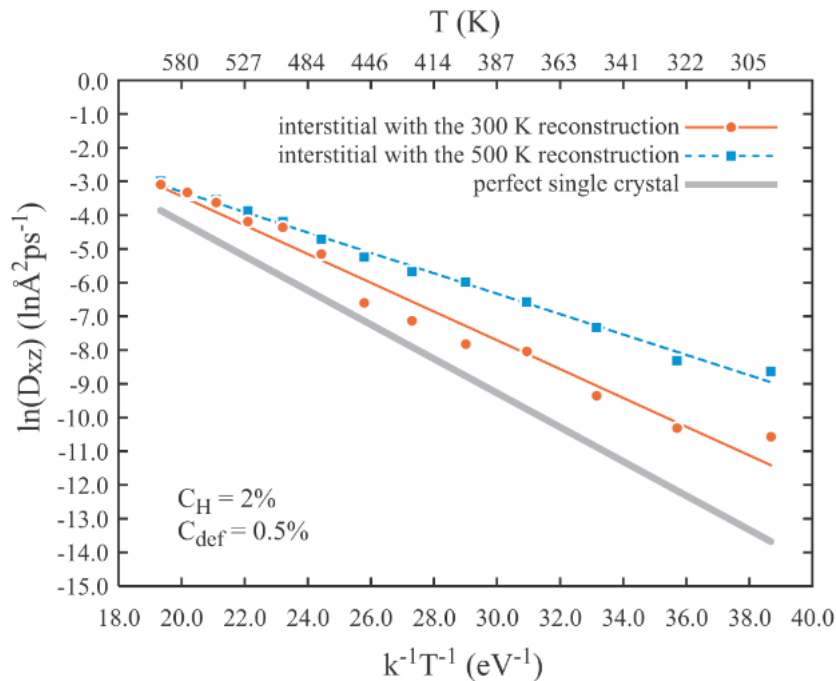


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# Statistical Effects of Initial $\Sigma 3\{111\}$ GB Reconstructions

(a) interstitial effects on xz diffusion in  $\Sigma 3\{111\}$  systems    (b) interstitial effects on y diffusion in  $\Sigma 3\{111\}$  systems



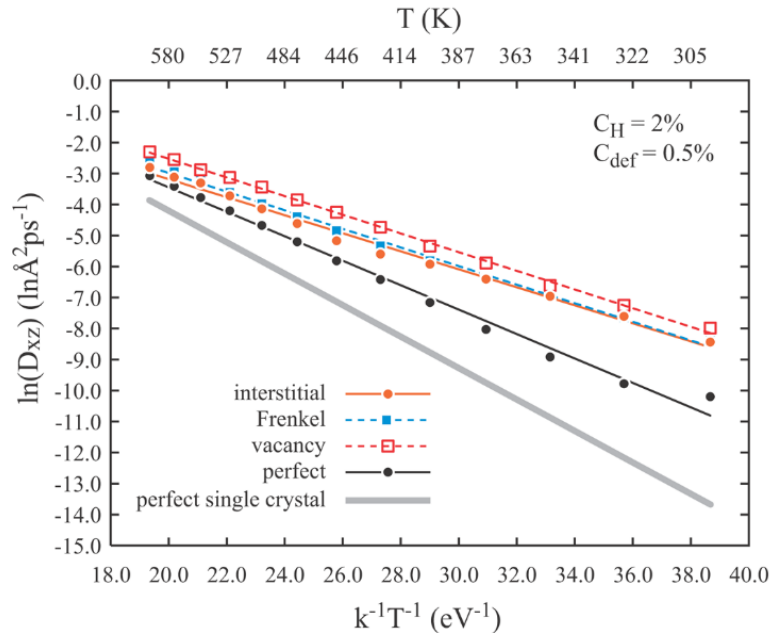
- Depending on reconstruction, the combination of interstitials and the  $\Sigma 3\{111\}$  grain boundary may significantly increase the on-plane diffusivities
- Interstitial increases on-plane diffusivities by 146.7 times at 300 K and 2.4 times at 600 K as compared with the boundary alone case
- Out-plane diffusivity is not significantly affected

$t = 440 \text{ ns}$

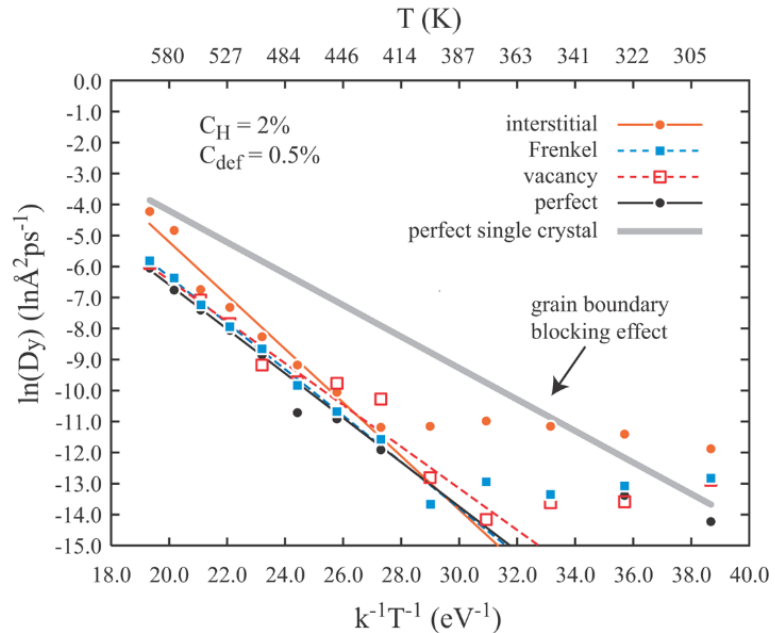


# Defect Effects on H Diffusion in Ni with $\Sigma 5\{100\}$ GB

(a) defect effects on xz diffusion in  $\Sigma 5\{100\}$  systems



(b) defect effects on y diffusion in  $\Sigma 5\{100\}$  systems



- The  $\Sigma 5\{100\}$  GB itself significantly increases the on-plane diffusion (relative to single crystal)
- All defects increase the on-plane diffusivities, especially vacancies (in single crystals, interstitials have the biggest effects and vacancies have negligible effects)
- Vacancy increases on-plane diffusivities by 9.2 times at 300 K and 2.2 times at 600 K as compared with the boundary alone case
- The out-plane diffusivities are significantly reduced as compared to bulk diffusion, indicating boundary trapping that is confirmed by the two segments

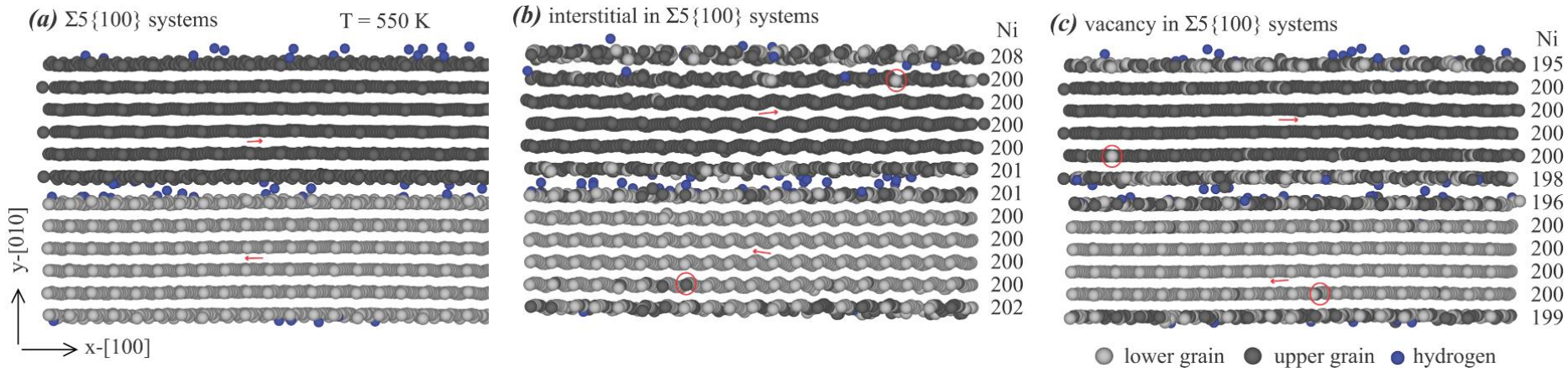
$t = 440 \text{ ns}$



# Visualization of $\Sigma 5\{100\}$ Grain Boundary

$$C_H = 2\%$$

$$C_{\text{def}} = 0.5\%$$

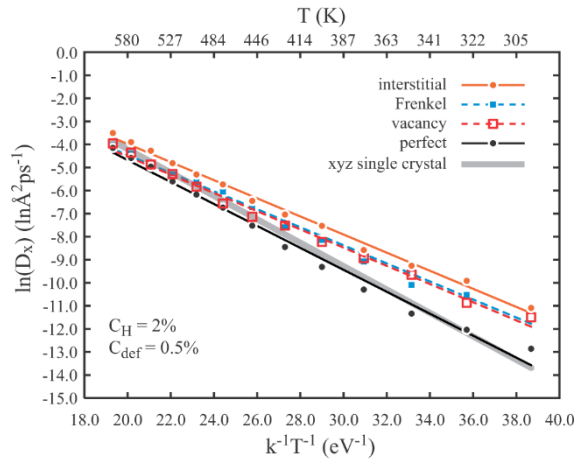


- Hydrogen atoms strongly segregates at the GB
- Ni interstitials and vacancies strongly segregate at the GB
- No change in the orientation of atomic rows
- Ni diffusion only occurs when ether interstitials or vacancies are present
- No statistical effects of initial configurations on diffusivities were found

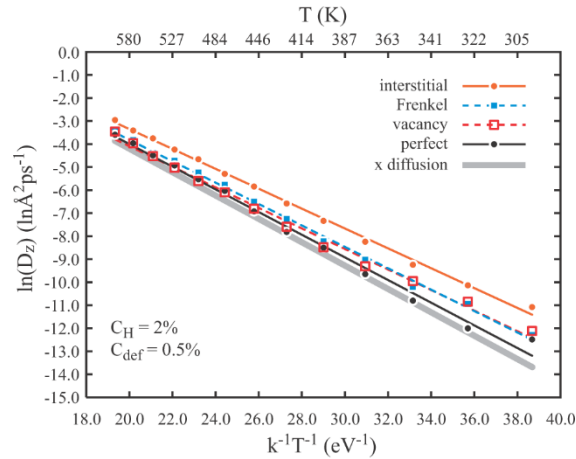


# Defect Effects on H Diffusion in Ni with $\Sigma 11\{311\}$ GB

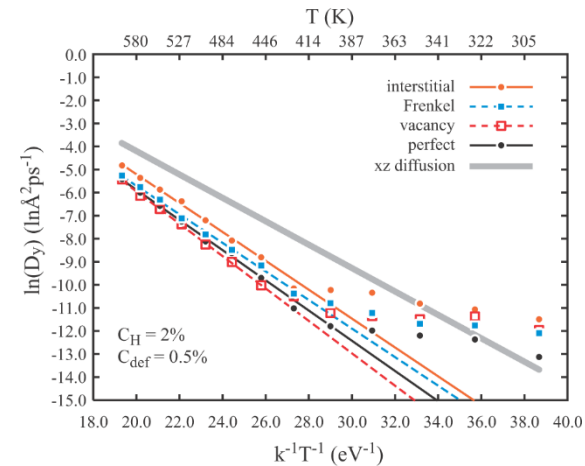
(a) defect effects on x diffusion in  $\Sigma 11\{311\}$  systems



(b) defect effects on z diffusion in  $\Sigma 11\{311\}$  systems



(c) defect effects on y diffusion in  $\Sigma 11\{311\}$  systems



- Diffusivities in the two on-plane directions slightly differ
- Defects increase on-plane diffusivities especially at low temperatures
- Interstitials most significantly increase on-plane diffusivities
- In the x- direction, interstitials increase diffusivities by 5.9 times at 300 K and 1.9 times at 600 K as compared with the boundary alone case
- In the z- direction, interstitials increase diffusivities by 4.1 times at 300 K and 1.9 times at 600 K as compared with the boundary alone case
- The out-plane diffusivities are significantly reduced as compared to bulk diffusion, indicating boundary trapping that is confirmed by the two segments

**t = 440 ns**

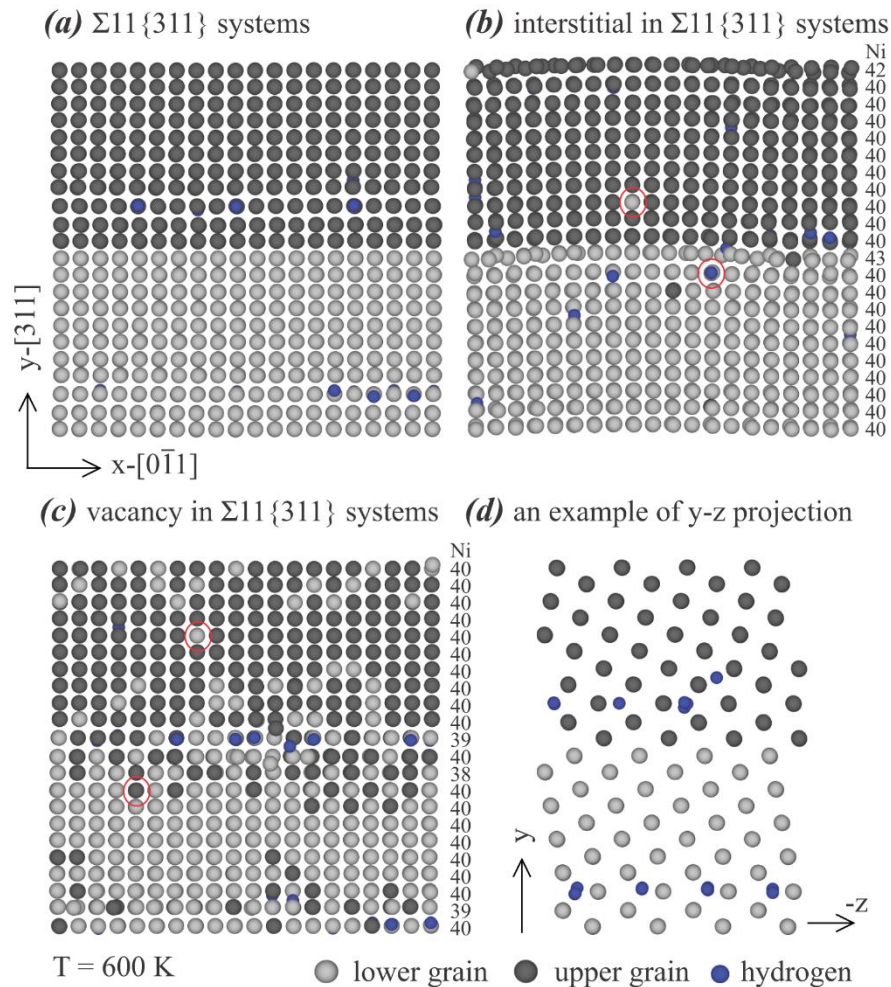


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# Visualization of $\Sigma 11\{311\}$ Grain Boundary



- Hydrogen atoms strongly segregates at the GB
- Ni interstitials and vacancies strongly segregate at the GB
- No change in the orientation of atomic rows
- Ni diffusion only occurs when either interstitials or vacancies are present
- No statistical effects of initial configurations on diffusivities were found

$$C_H = 2\%, C_{\text{def}} = 0.5\%$$



# Activation Energy and Pre-exponential Factors

Table I. Activation energies  $Q$  and pre-exponential factors  $D_0$  for different cases. Note that subscript “xyz” indicates isotropic bulk diffusion, “y” indicates out-plane diffusion, “xz” indicate isotropic in-plane diffusion, “x” and “z” indicate that the anisotropic in-plane diffusion is further split into two directions.

	No defects	Vacancies	Interstitials		Frenkel pairs
	Single crystals				
$Q_{xyz}$ (eV)	0.508	0.455	0.407		0.435
$D_{0,xyz}$ ( $\text{\AA}^2/\text{ps}$ )	$3.835\times10^2$	$8.925\times10^1$	$5.959\times10^1$		$9.075\times10^1$
	$\Sigma 3\{111\}$				
$Q_{xz}$ (eV)	0.483	0.465	0.441	0.302	0.427
$D_{0,xz}$ ( $\text{\AA}^2/\text{ps}$ )	$2.283\times10^2$	$1.190\times10^2$	$2.336\times10^2$	$1.553\times10^1$	$8.116\times10^1$
$Q_y$ (eV)	0.475	0.448	0.459	0.453	0.455
$D_{0,y}$ ( $\text{\AA}^2/\text{ps}$ )	$1.666\times10^2$	$8.089\times10^1$	$1.941\times10^2$	$1.503\times10^2$	$1.352\times10^2$
	$\Sigma 5\{100\}$				
$Q_{xz}$ (eV)	0.395	0.301	0.291		0.300
$D_{0,xz}$ ( $\text{\AA}^2/\text{ps}$ )	$8.623\times10^1$	$3.376\times10^1$	$1.413\times10^1$		$2.073\times10^1$
$Q_y$ (eV)	0.716	0.672	0.864		0.747
$D_{0,y}$ ( $\text{\AA}^2/\text{ps}$ )	$2.289\times10^3$	$1.116\times10^3$	$1.767\times10^5$		$5.497\times10^3$
	$\Sigma 11\{311\}$				
$Q_x$ (eV)	0.476	0.395	0.393		0.391
$D_{0,x}$ ( $\text{\AA}^2/\text{ps}$ )	$1.271\times10^2$	$2.907\times10^1$	$4.808\times10^1$		$2.888\times10^1$
$Q_z$ (eV)	0.493	0.447	0.432		0.465
$D_{0,z}$ ( $\text{\AA}^2/\text{ps}$ )	$3.474\times10^2$	$1.262\times10^2$	$1.983\times10^2$		$2.420\times10^2$
$Q_y$ (eV)	0.655	0.703	0.627		0.620
$D_{0,y}$ ( $\text{\AA}^2/\text{ps}$ )	$1.388\times10^2$	$3.342\times10^2$	$1.528\times10^2$		$8.077\times10^2$

Table II. Hydrogen-defect interaction energy (eV).

Point defects		Grain boundaries		
Vacancies	Interstitials	$\Sigma 3\{111\}$	$\Sigma 5\{100\}$	$\Sigma 11\{311\}$
-0.18	-0.12	-0.03	-0.20	-0.24

$$C_H = 2\%$$

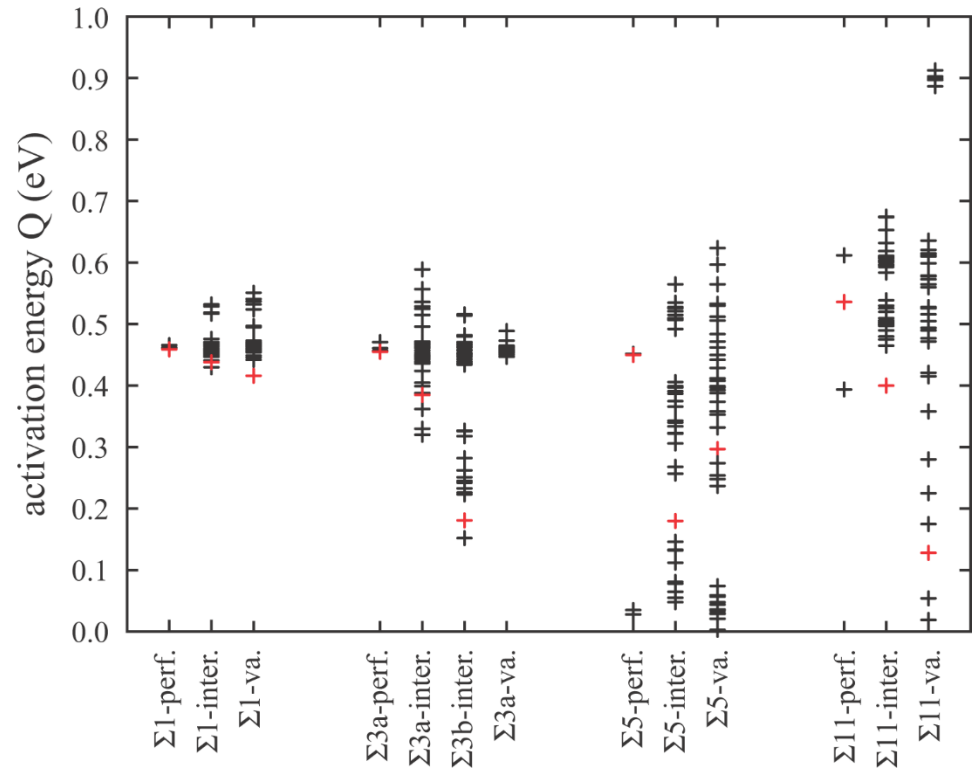
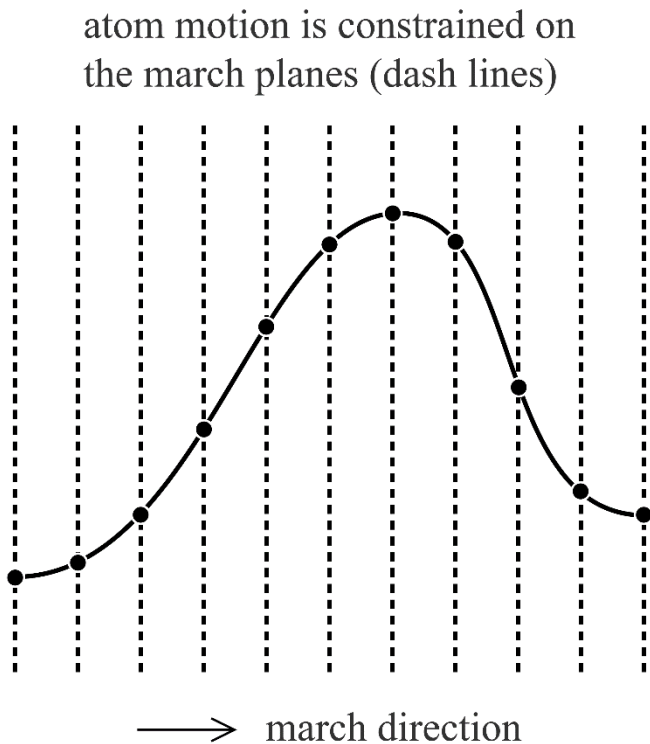
$$C_{\text{def}} = 0.5\%$$

Point defects + grain boundaries can reduce on-plane diffusion energy barrier, in agreement with experiments\*

\*A. Qudriss, J. Creus, J. Bouhattate, E. Conforto, C. Berziou, C. Savall, and X. , Acta Mater., 60, 6814 (2012).

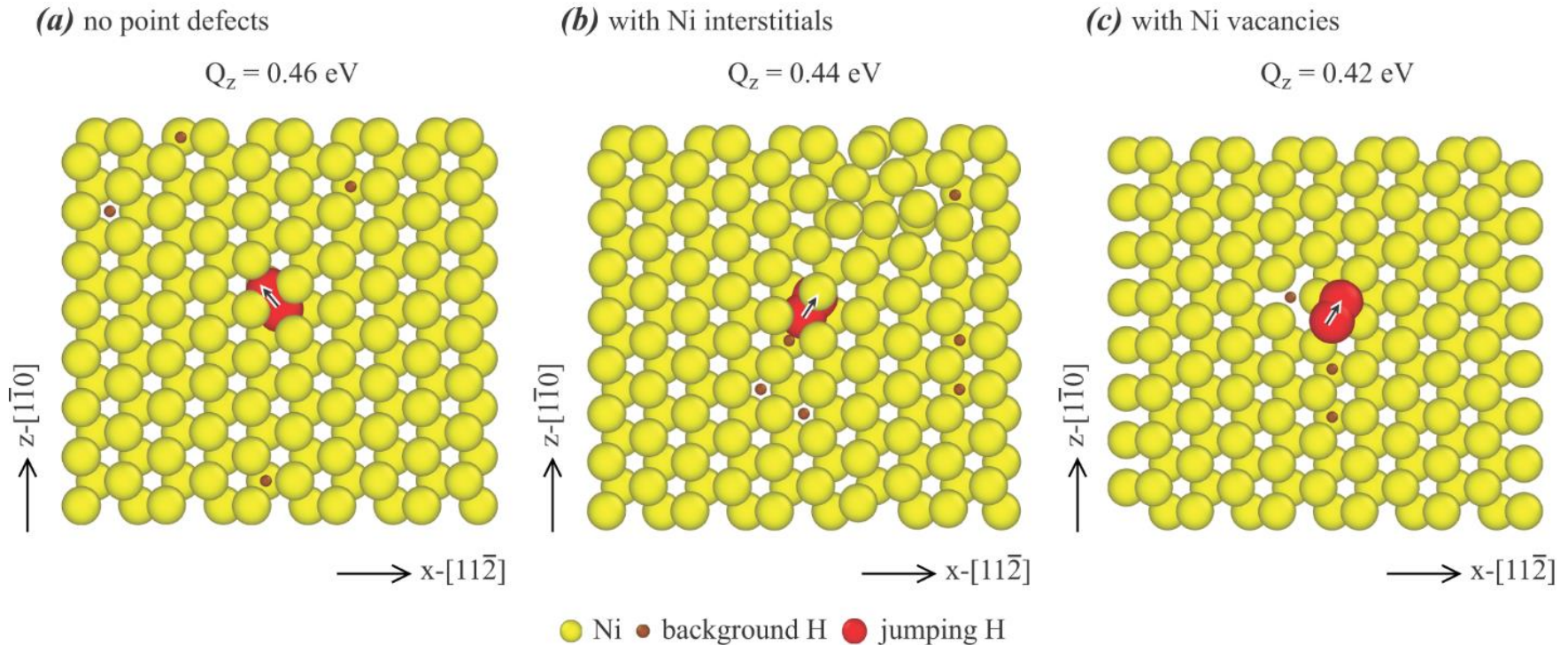
By placing hydrogen at different locations, MD simulations at 100 K are used to calculate time-averaged interaction energies between hydrogen and various defects

# Activation Energy of Individual Jumps



- By sequentially marching the hydrogen atoms in the three coordinate directions and relaxing the structure with the marching atom constrained on the marching plane, molecular statics can be used to calculate the energy barrier of atomic jumps
- This method can be easily automated to calculate a variety of atomic jumps

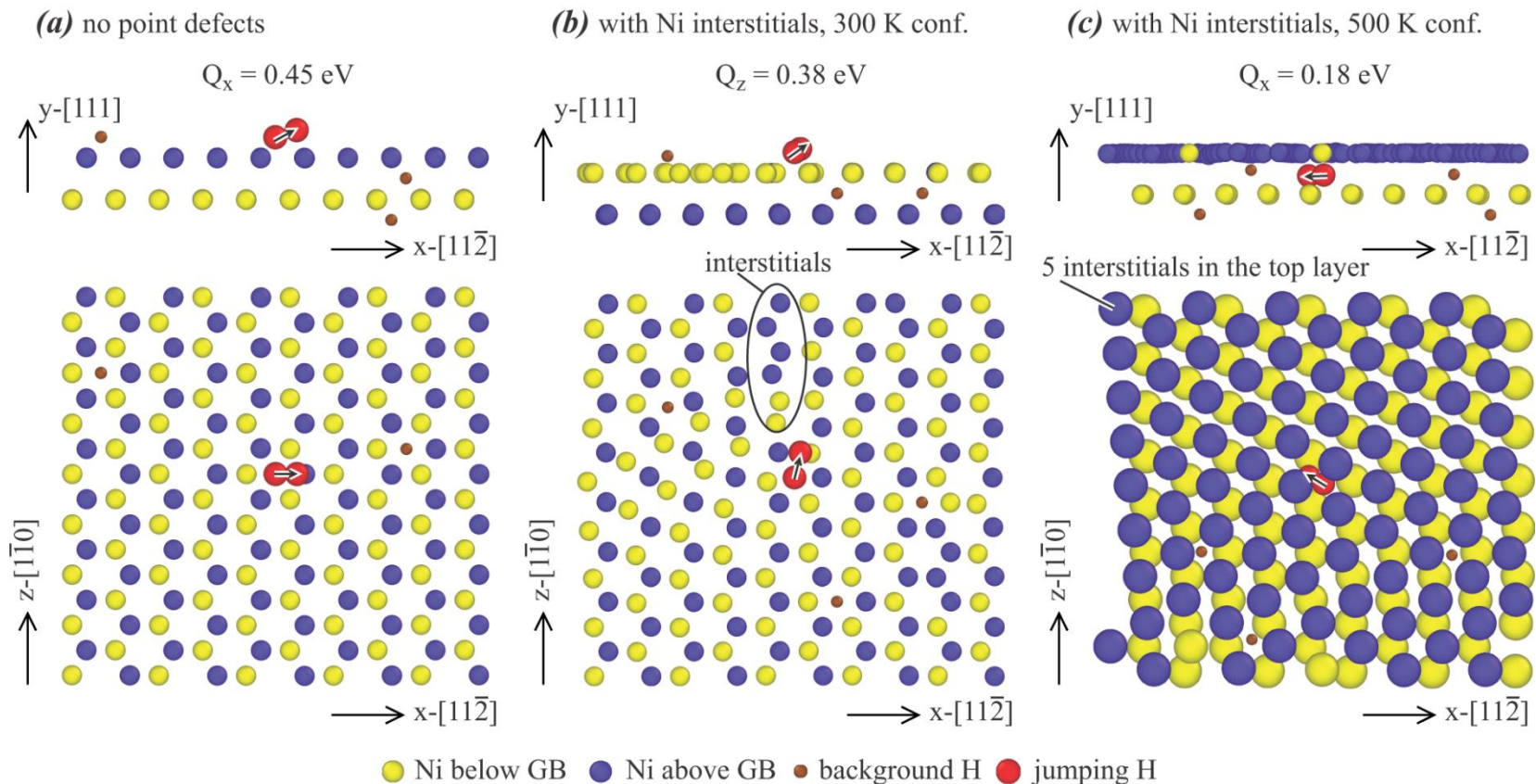
# Visualization of Atomic Jumps in Single Crystal



Presence of nickel interstitials or vacancies can reduce the energy barrier of some hydrogen jump paths, but not too much



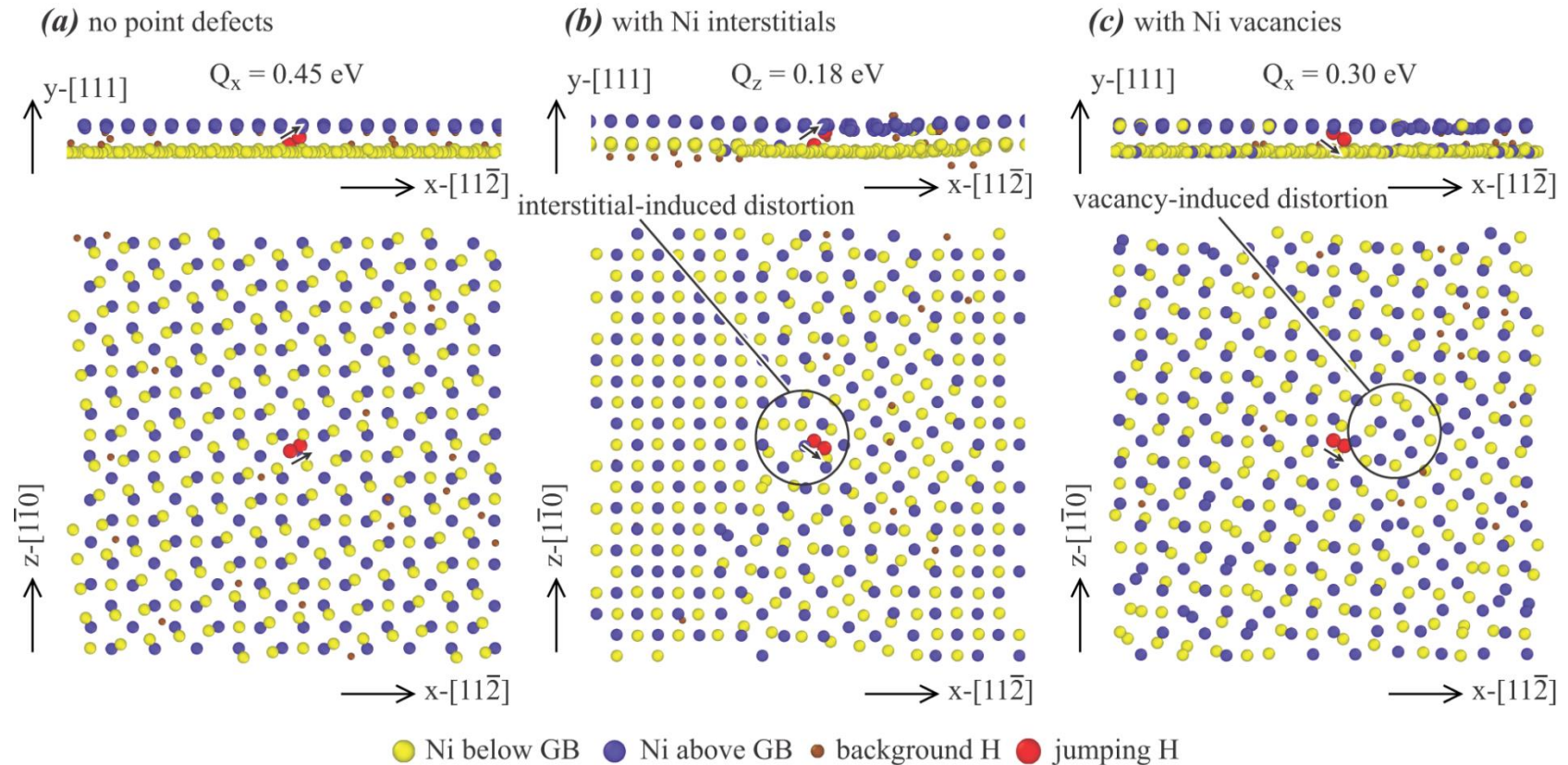
# Visualization of Atomic Jumps near the $\Sigma 3$ GB



- Presence of nickel interstitials or vacancies can reduce the energy barrier of some hydrogen jump paths further from GB effects alone
- The 500 K initial configuration more effectively reduces the energy barrier because the 5 nickel interstitials are uniformly distributed

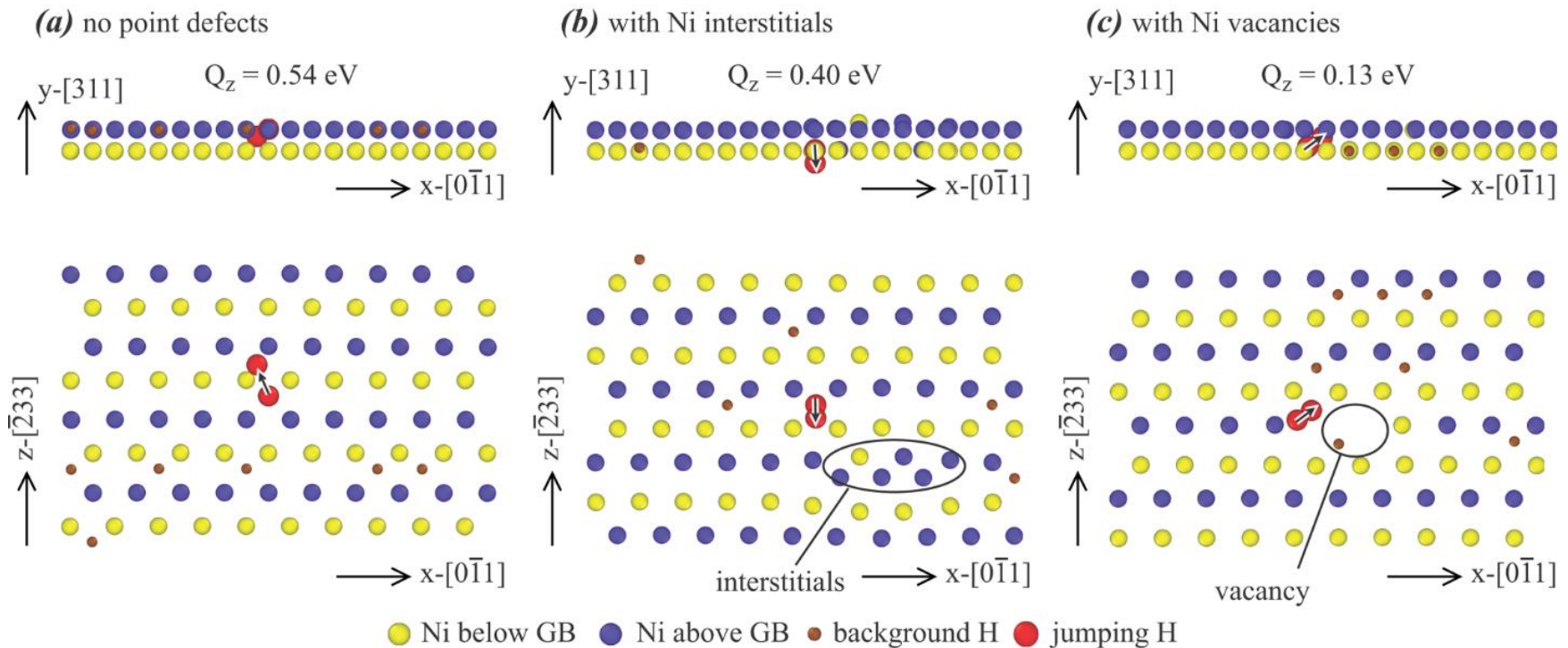


# Visualization of Atomic Jumps near the $\Sigma 5$ GB



- Presence of nickel interstitials or vacancies can reduce the energy barrier of some hydrogen jump paths further from GB effects alone
- Both interstitials and vacancies cause local distortion

# Visualization of Atomic Jumps near the $\Sigma 11$ GB



- Presence of nickel interstitials or vacancies can reduce the energy barrier of some hydrogen jump paths further from GB effects alone
- Local interstitials and vacancies are more clearly defined than the  $\Sigma 5$  grain boundary case

# Major Conclusions

1. Robust MD diffusion simulation methods have been developed to account for statistical interactions between diffusion species, grain boundaries, and irradiated defects. Highly converged results with almost no statistical errors are demonstrated
2. The predicted activation energy of H diffusion in defect-free single crystal Ni, 0.51 eV, compares well with the experimental value, 0.40 eV
3. For single crystals, 0.5% interstitial increases H diffusivities by 16.3 times at 300 K and 1.4 times at 600 K as compared with perfect crystals. Vacancy does not sensitively change diffusivities
4. Interstitials cause different reconstructions of  $\Sigma 3\{111\}$  grain boundaries. Some reconstructions may have significantly increased on-plane H diffusivities: by 146.7 times at 300 K and 2.4 times at 600 K as compared with the boundary alone case
5. Defects significantly increase on-plane H diffusivities on  $\Sigma 5\{100\}$  grain boundary
6.  $\Sigma 5\{100\}$  and  $\Sigma 11\{311\}$  grain boundaries have significant H trapping effects, leading to significantly reduced out-plane H diffusivities
7. Molecular statics calculations of energy barriers of individual jumps help understand the mechanisms of diffusivity changes



# The Development of Fe-Ni-Cr Potential

- The real material applied is stainless steels, not nickel
- Bonny et al also have an earlier version of the Fe-Ni-Cr potential (MSMSE, 19, 085008, 2011). Tong et al also developed a MEAM Fe-Ni-Cr-N potential recently (Molecular Simulation, 42, 1256, 2016). We are currently evaluating both potentials
- We are also developing an Fe-Ni-Cr EAM potential suitable for our applications where stacking fault energy and lattice constant are important
- In addition to the conventional fitting of selected properties, we require our potential to capture a single austenitic phase at high temperatures, and coexistence of ferritic and austenitic phases at low temperatures
- Validate the stability of our potential using vapor deposition simulations
- All the results are obtained from time-averaged MD simulations



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# Issues of EAM Formulation

$$E = \sum_{i=1}^N F_I(\rho_i) + \frac{1}{2} \sum_{i=1}^N \sum_{\substack{j=1 \\ j \neq i}}^N \phi_{IJ}(\mathbf{r}_{ij})$$

Embedding energy

Pair energy

$$\rho_i = \sum_{\substack{j=1 \\ j \neq i}}^N \rho_j^a(\mathbf{r}_{ij})$$

Electron density

- For elemental systems, any linear term added to the embedding energy can be exactly subtracted by a linear term in the pair energy

$$\sum_{i=1}^N [F_I(\rho_i) + k\rho_i] + \frac{1}{2} \sum_{i=1}^N \sum_{\substack{j=1 \\ j \neq i}}^N [\phi_{IJ}(\mathbf{r}_{ij}) - 2k\rho_j^a(\mathbf{r}_{ij})] = \sum_{i=1}^N F_I(\rho_i) + \frac{1}{2} \sum_{i=1}^N \sum_{\substack{j=1 \\ j \neq i}}^N \phi_{IJ}(\mathbf{r}_{ij})$$

- Any factor multiplied to the electron density can be exactly divided away in the embedding energy. This impacts alloys

$$F_I(\rho_i) = F_I \left[ k \cdot \left( \frac{\rho_i}{k} \right) \right]$$

- These result in poor parameterization





# Improved Embedding Energy Function

- Requiring zero derivatives independently for embedding and pair energies for the equilibrium phase removes one flexibility. Using relative electron density  $\rho/\rho_e$  removes the other flexibility that helps the alloy parameterization
- Our splined embedding energy function has three advantages: removes both flexibilities, has the correct shape, and can be fitted to up to the third derivative

$$F_I(\rho) = \begin{cases} \sum_{i=0}^3 f_{ni,I} \left( \frac{\rho}{\rho_{n,I}} - 1 \right)^i, & \rho < \rho_{n,I}, \rho_{n,I} = s_{1,I} \rho_{e,I} \\ \sum_{i=0}^3 f_{i,I} \left( \frac{\rho}{\rho_{e,I}} - 1 \right)^i, & \rho_{n,I} \leq \rho < \rho_{m,I}, \rho_{m,I} = s_{2,I} \rho_{e,I} \\ f_{e0,I} + f_{e1,I} \left( \frac{\rho}{\rho_{m,I}} - 1 \right) + \frac{2f_{e2,I}}{\eta_I} \left[ \sqrt{1 + \eta_I \left( \frac{\rho}{\rho_{m,I}} - 1 \right)^2} - 1 \right], & \rho_{m,I} \leq \rho \end{cases}$$

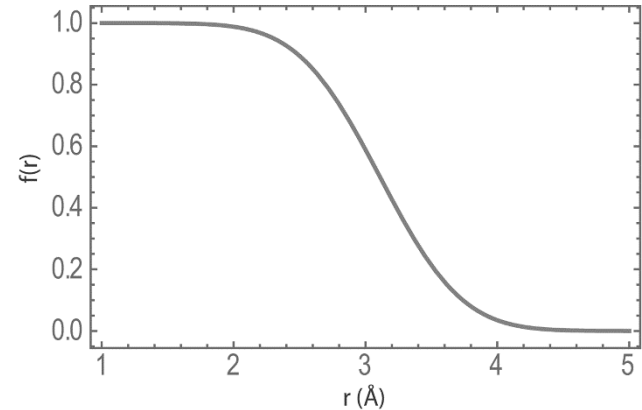


# Improved Cutoff

- A cutoff function is proposed to take the form of

$$f_{c,IJ}(r) = \begin{cases} \frac{1}{2} \operatorname{erfc} \left[ \frac{\mu(r - r_{s,IJ}) + v(r_{c,IJ} - r)}{r_{c,IJ} - r_{s,IJ}} \right], & r < r_{c,IJ} \\ 0, & r \geq r_{c,IJ} \end{cases}$$

where  $\operatorname{erfc}(\mu) = 10^{-5}$ ,  $\operatorname{erfc}(v) = 0.9$



- Multiply this cutoff function to any pair function will not change the value of the pair function, but will allow the pair function to be cutoff with continuous high order derivatives
- More importantly, this cutoff function will allow the cutoff distance to be treated as a fitting parameter



# Properties of Selected Elemental Phases

Calculated (cal.) and target (tar.) values of lattice constants  $a$  and  $c$  (Å), cohesive energy  $E_c$  (eV/atom), and elastic constants  $C_{11}$ ,  $C_{12}$ , and  $C_{44}$  (eV/Å<sup>3</sup>) for various elemental structures. ---: non-existing, /: uncalculated or not available, \*: experimental [1-4], †: our DFT calculations.

material structure		a		c		$E_c$		$C_{11}$		$C_{12}$		$C_{44}$	
		cal.	tar.	cal.	tar.	cal.	tar.	cal.	tar.	cal.	tar.	cal.	tar.
Fe	<i>fcc</i>	3.63	3.47 <sup>†</sup>	----	----	-4.280	-4.866 <sup>†</sup>	1.27	2.02 <sup>†</sup>	0.79	0.66 <sup>†</sup>	0.84	1.25 <sup>†</sup>
	<i>bcc</i>	2.87	2.87 <sup>*</sup>	----	----	-4.280	-4.280 <sup>*</sup>	2.10	1.52 <sup>*</sup>	1.06	0.86 <sup>*</sup>	1.05	0.76 <sup>*</sup>
	<i>hcp</i>	2.57	2.43 <sup>†</sup>	4.09	3.97 <sup>†</sup>	-4.278	/	/	/	/	/	/	/
Ni	<i>fcc</i>	3.52	3.52 <sup>*</sup>	----	----	-4.432	-4.432 <sup>*</sup>	1.63	1.63 <sup>*</sup>	0.94	0.94 <sup>*</sup>	0.82	0.82 <sup>*</sup>
	<i>bcc</i>	2.75	2.80 <sup>†</sup>	----	----	-4.305	-4.697 <sup>†</sup>	0.14	0.93 <sup>†</sup>	0.50	1.32 <sup>†</sup>	0.34	1.02 <sup>†</sup>
	<i>hcp</i>	2.48	2.49 <sup>†</sup>	4.18	4.06 <sup>†</sup>	-4.392	/	/	/	/	/	/	/
Cr	<i>fcc</i>	3.66	3.62 <sup>†</sup>	----	----	-4.090	-3.734 <sup>†</sup>	1.44	0.12 <sup>†</sup>	1.00	2.19 <sup>†</sup>	0.73	-0.57 <sup>†</sup>
	<i>bcc</i>	2.88	2.88 <sup>*</sup>	----	----	-4.094	-4.094 <sup>*</sup>	2.67	2.46 <sup>*</sup>	1.14	0.95 <sup>*</sup>	0.83	0.55 <sup>*</sup>
	<i>hcp</i>	2.59	2.56 <sup>†</sup>	4.12	4.18 <sup>†</sup>	-4.084	/	/	/	/	/	/	/

- [1] J. D. H. Donnay, and H. M. Ondik, Crystal Data, Determinative Tables, 3rd ed., Vol. 2 (inorganic compounds) (U. S. Department of Commerce, National Bureau of Standards, and Joint Committee on Power Diffraction Standards, U. S. A., 1973)
- [2] I. Barin, Thermochemical Data of Pure Substances (VCH, Weinheim, 1993)
- [3] G. Simmons, and H. Wang, Single Crystal Elastic Constants and Calculated Aggregate Properties: A Handbook (MIT Press, Cambridge, 1971)
- [4] Palmer, S. B.; Lee, E. W. The elastic constants of chromium. Philos. Mag. 1971, 24, 311

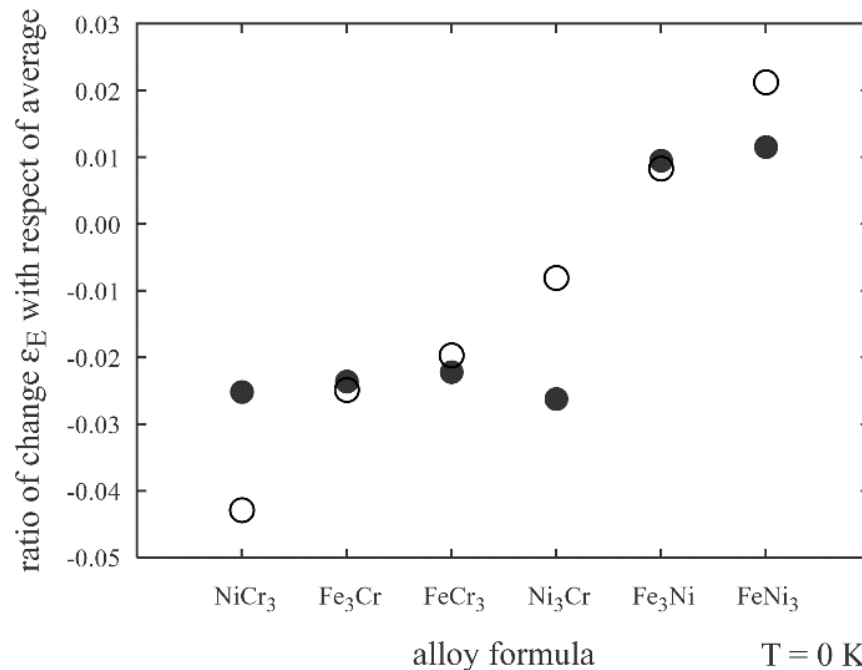


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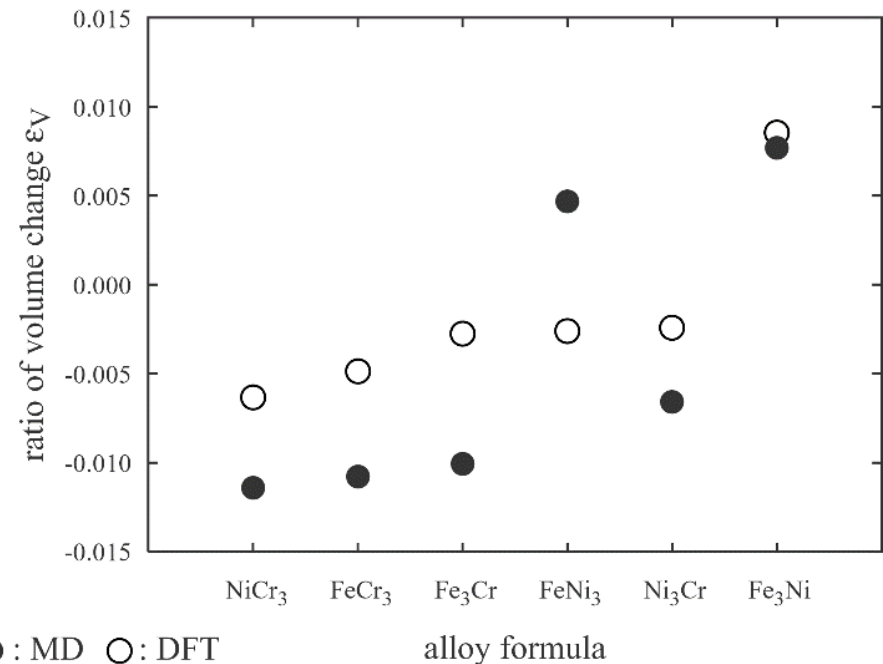


# Relative Change of Energy and Volume of Alloys with respect to Elements

(a) Energy



(b) Volume

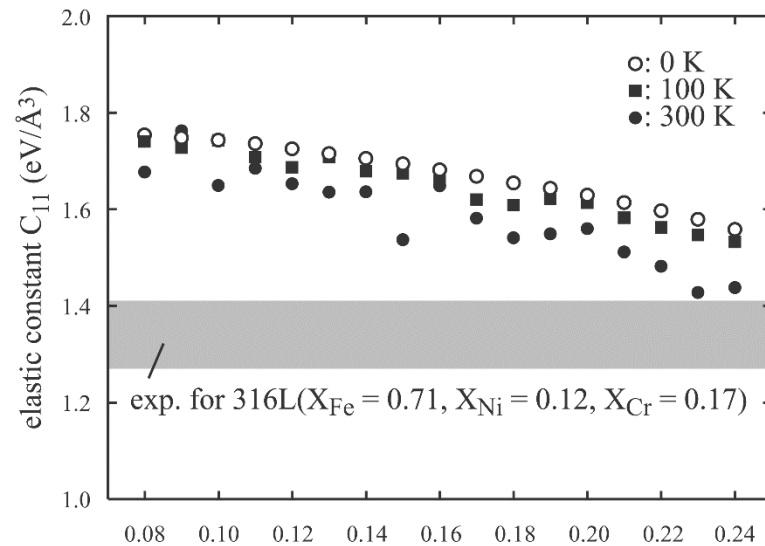


General trends match well between MD and DFT calculations

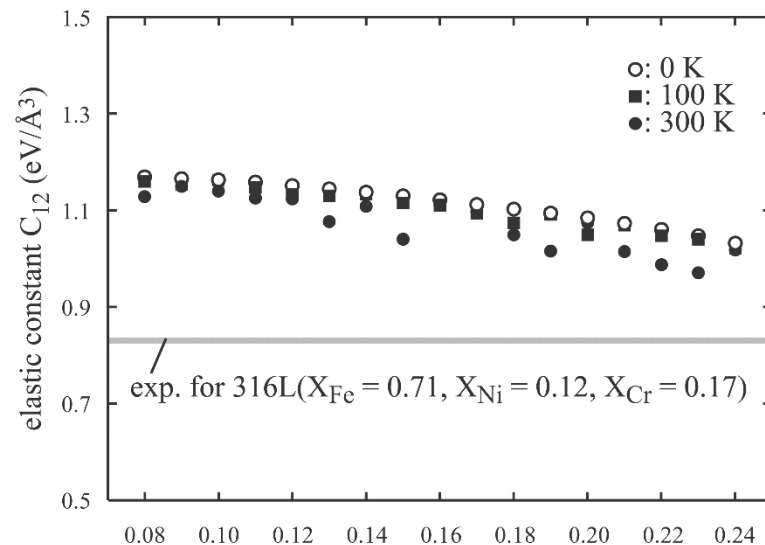


# Elastic Constants

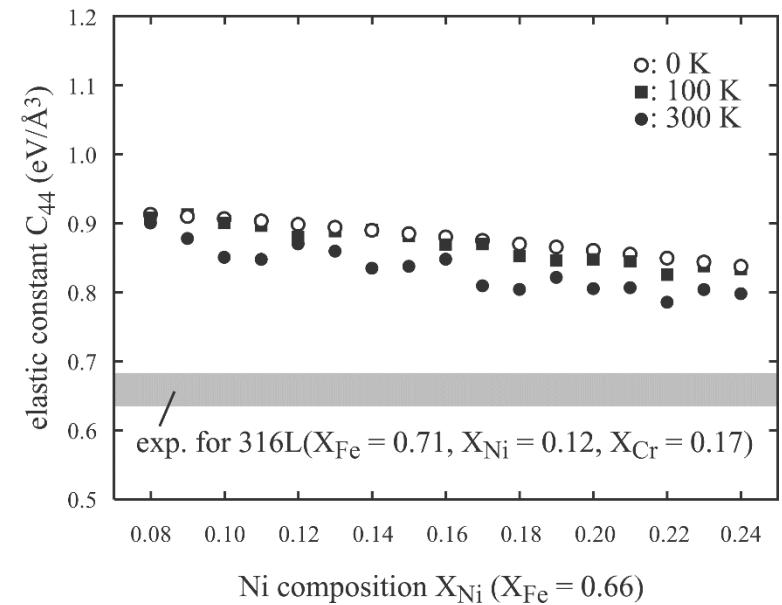
(a)  $C_{11}$



(b)  $C_{12}$



(c)  $C_{44}$



The elastic constants prescribed by the potential for alloys with  $X_{\text{Fe}} = 0.66$  seems to be slightly higher than the experimental values for 316L with  $X_{\text{Fe}} = 0.70$ , taken from Bonny et al, MSMSE, 19, 085008, 2011.

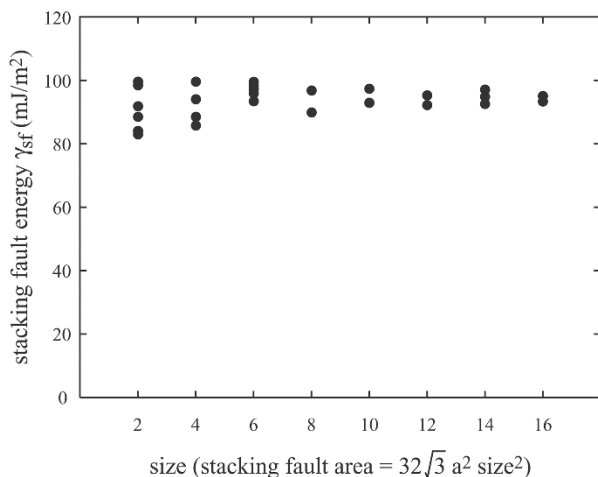




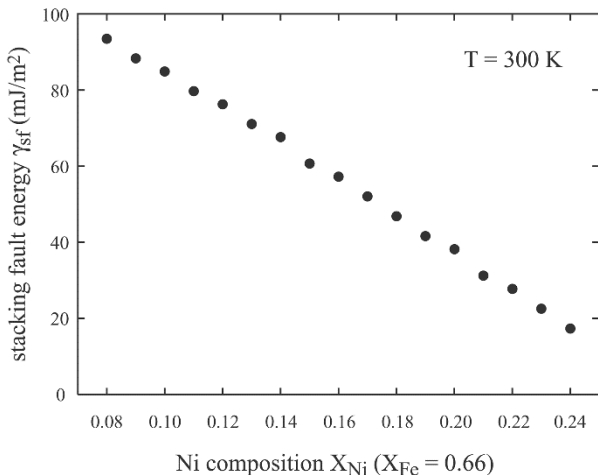
# Stacking Fault Energy

## Molecular Dynamics Results

(a) Convergence of stacking fault energy



(b) Converged stacking fault energy vs.  $X_{Ni}$



## Experimental data from Schramm and Reed, Metall. Trans. A, 6, 1345 (1975).

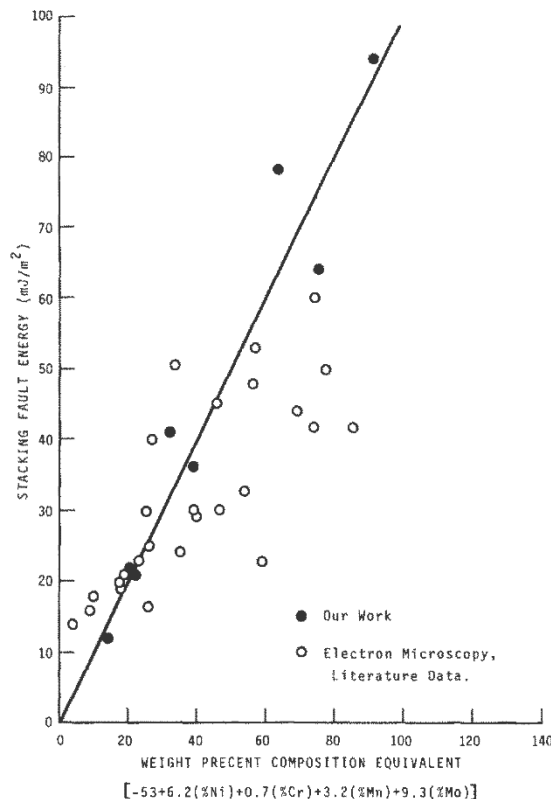


Fig. 4—Relationship between stacking fault energy and Fe-Ni-Cr-Mn-Mo composition in austenitic stainless steels.

The calculated stacking fault energy seems to be in the right order of magnitude



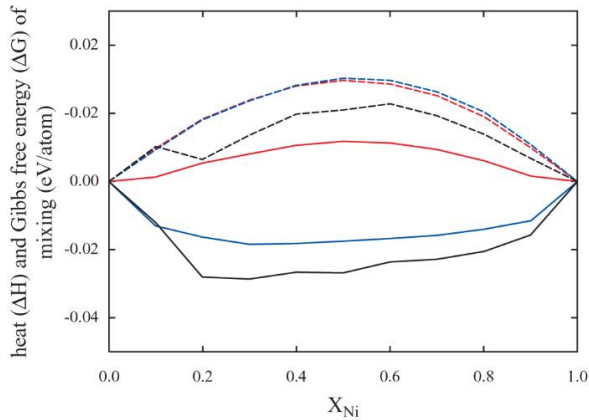
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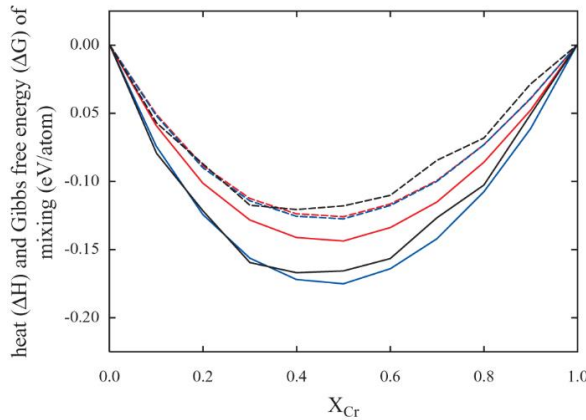
# Gibbs Free Energy of Mixing $\Delta G$

## Time-Averaged MD Calculations of $\Delta G$ and $\Delta H$

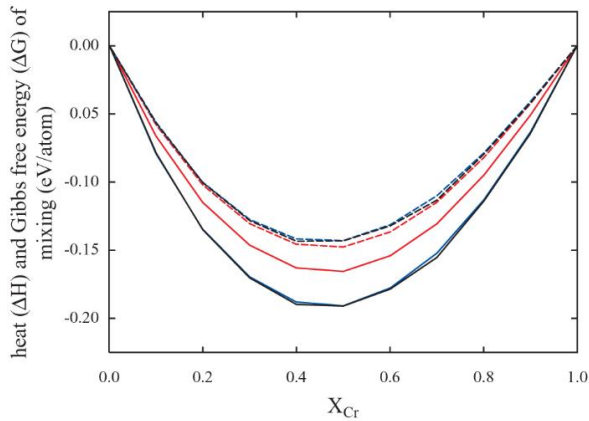
(a) Fe-Ni



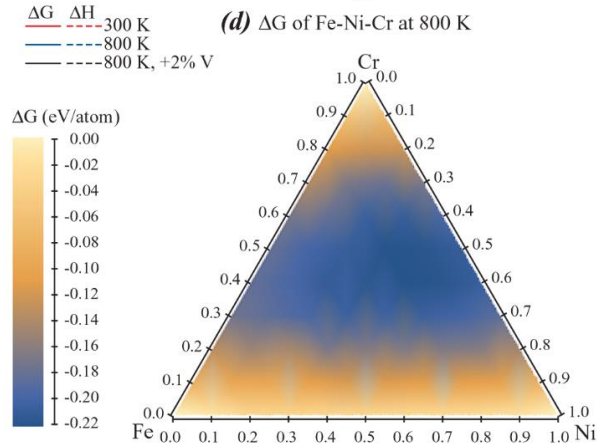
(b) Fe-Cr



(c) Ni-Cr

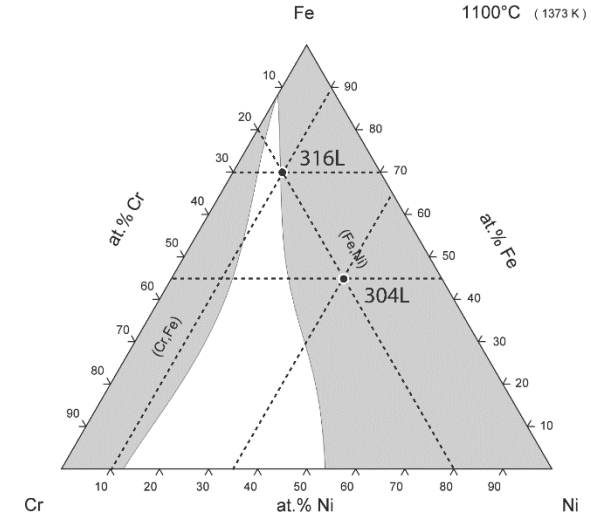


(d)  $\Delta G$  of Fe-Ni-Cr at 800 K



Our potential predicts single austenitic phase at high temperatures, sufficient for model 316L and 304L stainless steels

## ASM Phase Diagram © 2016



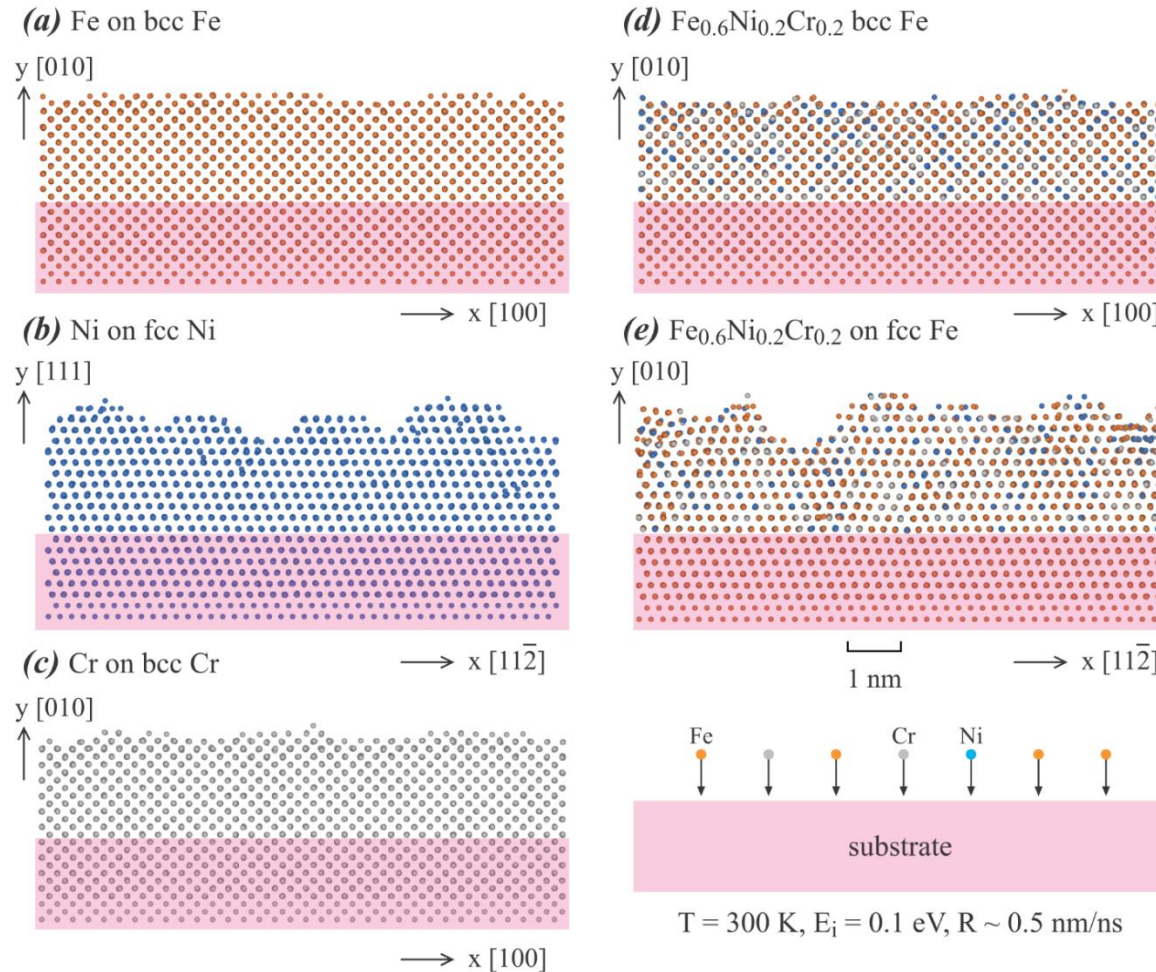
© ASM International 2006. Diagram No. 925639



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# Growth Simulation Validation



Crystalline growth is achieved for all observed phases, validating their stability in MD simulations



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# Major Conclusions

- Our new Fe-Ni-Cr EAM potential may be appropriate for studying mechanical properties of stainless steels
- The most significant advantages of the potential is that it enables stable simulations of the austenitic phase as well as co-existence of ferritic and austenitic phases



# Uncertainty Quantification: Ultimate Goal of Models

- Accuracy of interatomic potentials (likely not impact mechanisms and trends)
- Accuracy of molecular dynamics (MD) itself
  - ☐ Models that are absolutely accurate (e.g., dislocation core energy, diffusion energy barriers)
  - ☐ Models that we strongly believe (e.g., thin film structures)
  - ☐ Models that are plausible (e.g., dislocation mediated charge transport in TlBr)





# MD Uncertainty Quantification Methods

- MD can inform engineering scale models because when MD results are used as inputs, these models should make exactly the same predictions as MD regardless the potential
- All MD simulations involve statistical errors, but these errors can be quantified and reduced

The total MD simulated time  $t_{\text{tot}}$  is divided into  $N$  segments  $t_i = i\Delta t$  ( $i = 1, 2, \dots, N$ ,  $\Delta t = t_{\text{tot}}/N$ ). Each MD simulation produces  $N$  values of the time-averaged property  $P_i$  for each of the time intervals  $\Delta t_i = t_i - t_{i-1} = \Delta t$ . As a result, the best estimate of the property can be calculated as

$$\bar{P} = \frac{\sum_{i=1}^N P_i}{N} \quad (1)$$

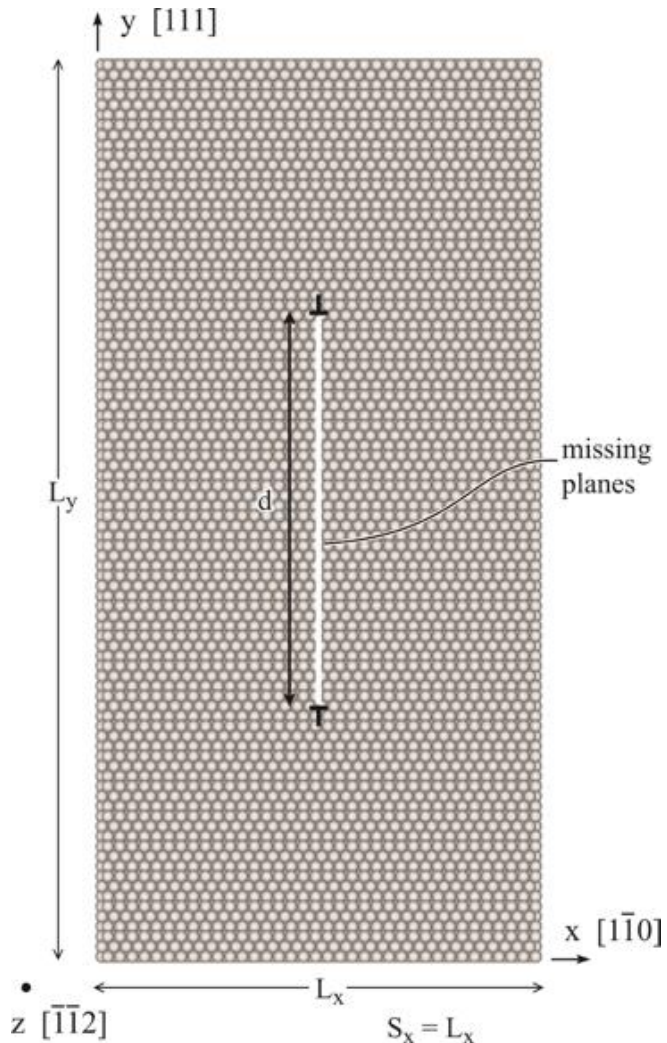
The uncertainty of the samples  $P_i$  can be quantified by the sample standard deviation defined as

$$\sigma = \sqrt{\frac{\sum_{i=1}^N (P_i - \bar{P})^2}{N-1}} \quad (2)$$

The best estimate  $\bar{P}$  is also associated with an uncertainty  $\bar{\sigma}$

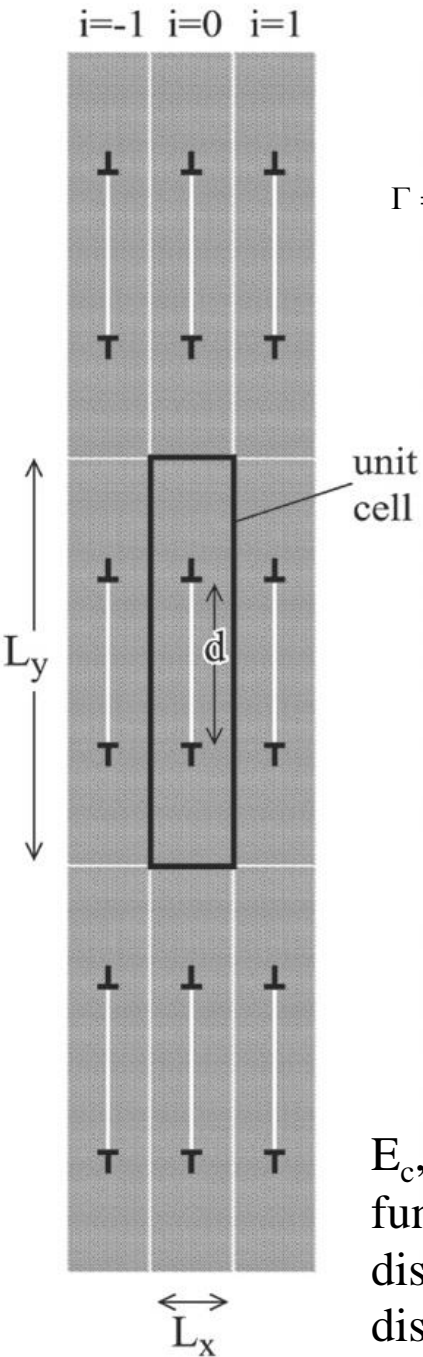
$$\bar{\sigma} = \frac{\sigma}{\sqrt{N}} \quad (3)$$

# Absolutely Accurate Example I: Dislocation Core Energy Calculation



- One can always create a perfect crystal and a crystal containing dislocations under the periodic boundary condition
- Energy of the perfect crystal can always be scaled towards the same number of atoms of the dislocated crystal
- Dislocation energy can always be calculated as the (scaled) energy difference between the dislocated and perfect crystals, without any assumptions
- Dislocation core energy can always be fitted to the continuum solution of the total dislocation energy

# Continuum Energy Expression



$$\Gamma = E_c + \frac{Gb^2}{4\pi(1-\nu)} \cdot \cos^2 \alpha + \sin^2 \beta \cdot E_{0,edge} + \cos^2 \beta \cdot E_{0,screw} + 2 \sin^2 \beta \cdot \sum_{i=1}^{\infty} E_{i,edge} + 2 \cos^2 \beta \cdot \sum_{i=1}^{\infty} E_{i,screw}$$

$$E_{0,edge} = \frac{Gb^2}{4\pi(1-\nu)} \left\{ \ln\left(\frac{d}{r_0}\right) + \ln\left(\frac{L_y - d}{L_y}\right) - \ln\left[Ga\left(\frac{L_y + d}{L_y}\right)\right] - \ln\left[Ga\left(2 - \frac{d}{L_y}\right)\right] \right\}$$

$$E_{0,screw} = \frac{Gb^2}{4\pi} \left\{ \ln\left(\frac{d}{r_0}\right) + \ln\left(\frac{L_y - d}{L_y}\right) - \ln\left[Ga\left(\frac{L_y + d}{L_y}\right)\right] - \ln\left[Ga\left(2 - \frac{d}{L_y}\right)\right] \right\}$$

$$E_{i,edge} = \frac{Gb^2}{8\pi(1-\nu)} \left\{ \frac{4\pi \cdot i \cdot L_x \cdot \coth\left(\frac{\pi \cdot i \cdot L_x}{L_y}\right) \cdot \sin^2\left(\frac{\pi \cdot d}{L_y}\right)}{L_y \cdot \cosh\left(\frac{2\pi \cdot i \cdot L_x}{L_y}\right) - L_y \cdot \cos\left(\frac{2\pi \cdot d}{L_y}\right)} + \ln\left[\cos^2\left(\frac{\pi \cdot d}{L_y}\right) + \coth^2\left(\frac{\pi \cdot i \cdot L_x}{L_y}\right) \cdot \sin^2\left(\frac{\pi \cdot d}{L_y}\right)\right] \right\}$$

$$E_{i,screw} = \frac{Gb^2}{8\pi} \ln\left[\cos^2\left(\frac{\pi \cdot d}{L_y}\right) + \coth^2\left(\frac{\pi \cdot i \cdot L_x}{L_y}\right) \cdot \sin^2\left(\frac{\pi \cdot d}{L_y}\right)\right]$$

$E_c$  independent of geometry!

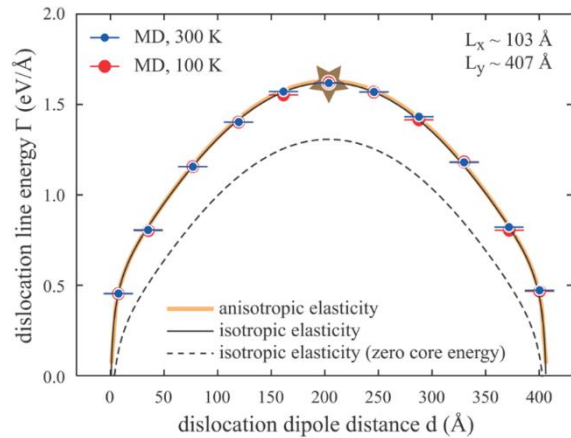
$E_c$ ,  $r_0$ : core energy, radius,  $Ga$ : Euler gamma function,  $\coth$ ,  $\cosh$ : hyperbolic functions,  $G$ ,  $\nu$ : shear modulus, Poisson's ratio,  $b$ : Burgers magnitude,  $\alpha$ : dislocation dipole direction ( $\alpha = 0^\circ$  means vertical dislocation dipole),  $\beta$ : dislocation character angle

# Time Averaged MD Simulations

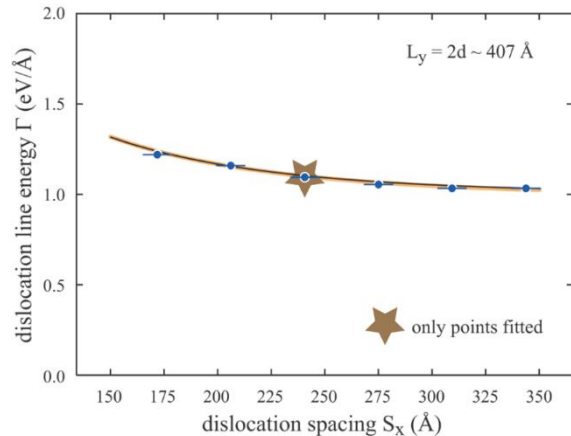
## ⇒ Convergence

### Edge Dislocation

(a) Effect of dislocation dipole distance  $d$

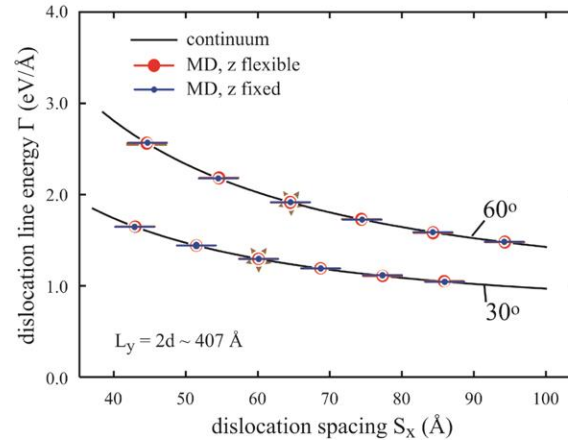


(b) Effect of dislocation spacing  $S_x (= L_x)$

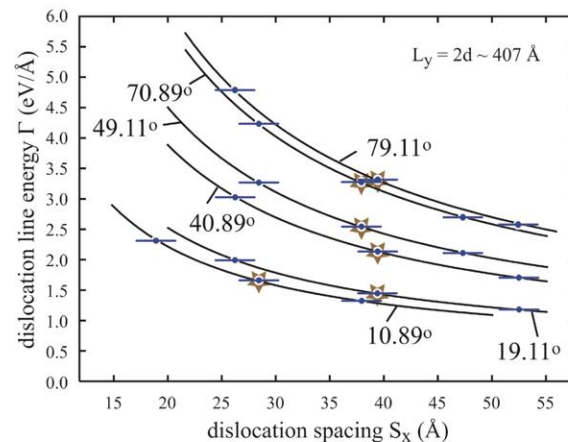


### Mixed Dislocations

(a) 30°, 60° dislocations

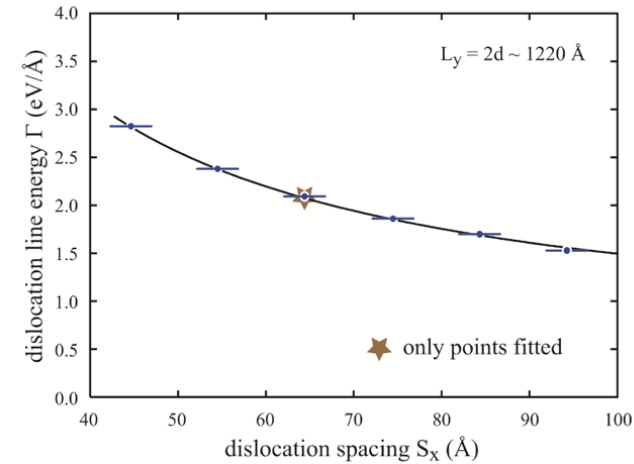


(b) 10.89°, 19.11°, 40.89°, 49.11°, 70.89°, 79.11° dislocations



### Screw Dislocation

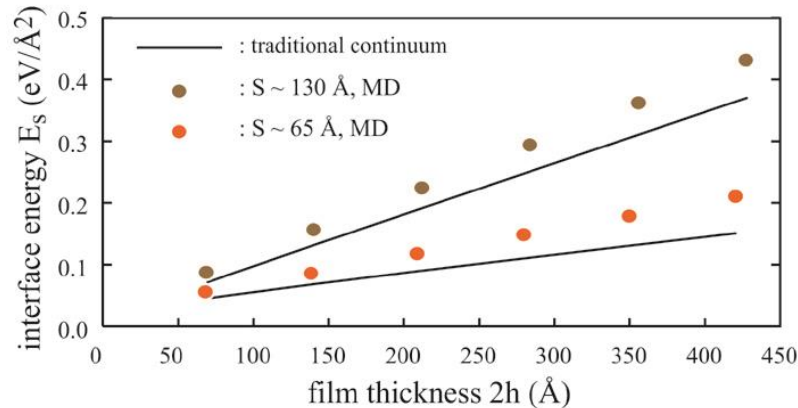
(c) 0.0° (screw) dislocation



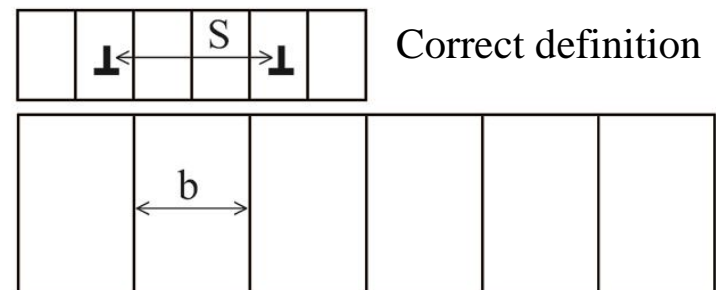
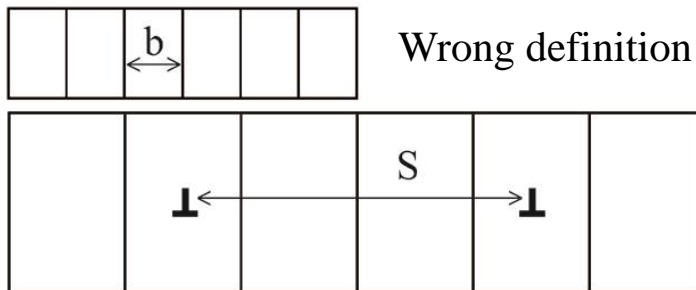
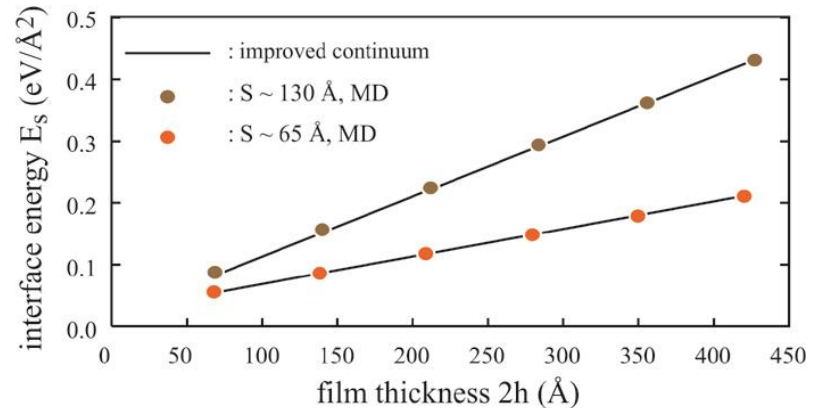
- Negligible error bars
- No time scale issue because error bars are already negligible
- No length scale issues because already captures the continuum solutions

# Absolutely Accurate MD Can Validate and Correct Classical Theories

(a) Traditional misfit dislocation theory



(b) MD guided improved misfit dislocation theory



- Continuum misfit dislocation theory has been widely used since 1980's
- MD simulations revealed that traditional continuum misfit dislocation theory is incorrect in the definition of dislocation Burgers vector and dislocation spacing
- This example indicates that absolutely accurate MD can “validate” and improve continuum models



# Absolutely Accurate Example II:

## Diffusion Energy Barrier Calculation

- Without assuming atomic jump paths, the coordinates  $\alpha_i(t)$  of diffusing atoms ( $i = 1, 2, \dots, N$ ), are recorded every  $\Delta t$ , i.e., at times of  $t = j\Delta t$ ,  $j = 1, 2, \dots, m$  ( $m = t_{\text{MD}}/\Delta t$ ), where  $\Delta t$  can be any multiple of the time step size  $dt$  used in the MD simulations
- $m+1-k$  measurements can be made for the displacement of each diffusing atom  $i$  over a  $k\Delta t$  period:  $\Delta\alpha_{i,j}(k\Delta t) = \alpha_i(j\Delta t - \Delta t + k\Delta t) - \alpha_i(j\Delta t - \Delta t)$  where  $j = 1, 2, \dots, m+1-k$ .
- This allows us to calculate mean square displacement (MSD):

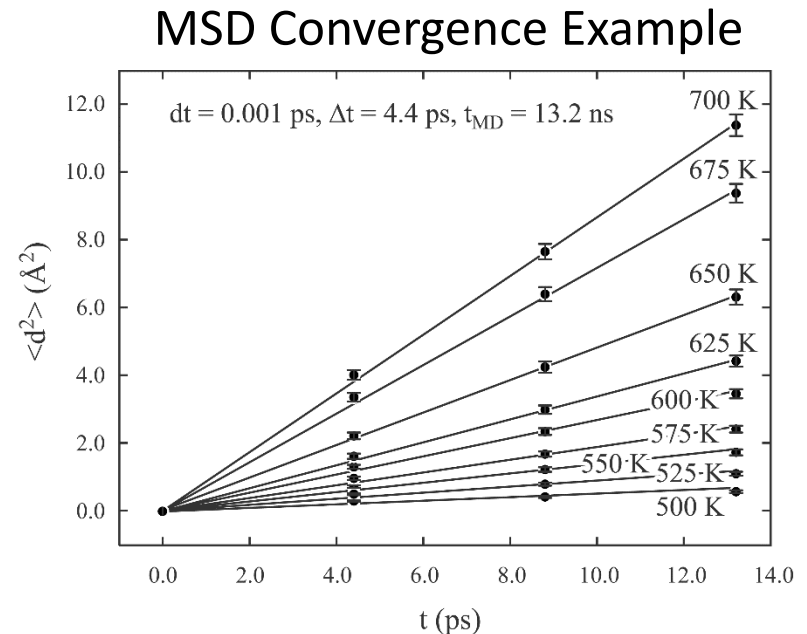
$$\langle [\Delta\alpha(k\Delta t)]^2 \rangle = \frac{\sum_{i=1}^N \sum_{j=1}^{m+1-k} [\Delta\alpha_{i,j}(k\Delta t)]^2}{N(m+1-k)}$$

- MSD can be fitted to diffusivities  $D$ :

$$\langle [\Delta\alpha(k\Delta t)]^2 \rangle = 2D_{\alpha}t$$

$$\langle [\Delta x(k\Delta t)]^2 \rangle + \langle [\Delta z(k\Delta t)]^2 \rangle = 4D_{xz}t$$

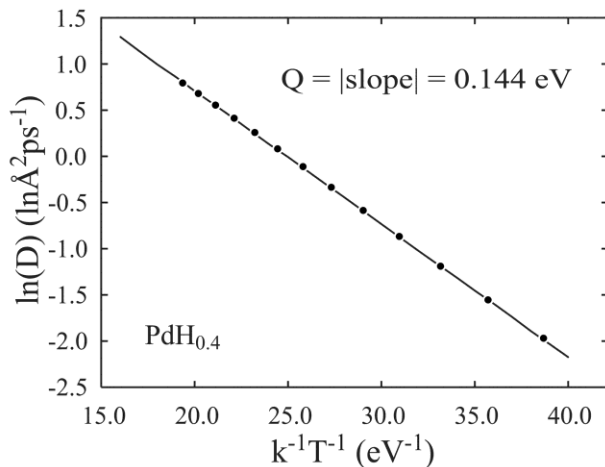
$$\langle [\Delta x(k\Delta t)]^2 \rangle + \langle [\Delta y(k\Delta t)]^2 \rangle + \langle [\Delta z(k\Delta t)]^2 \rangle = 6D_{xyz}t$$



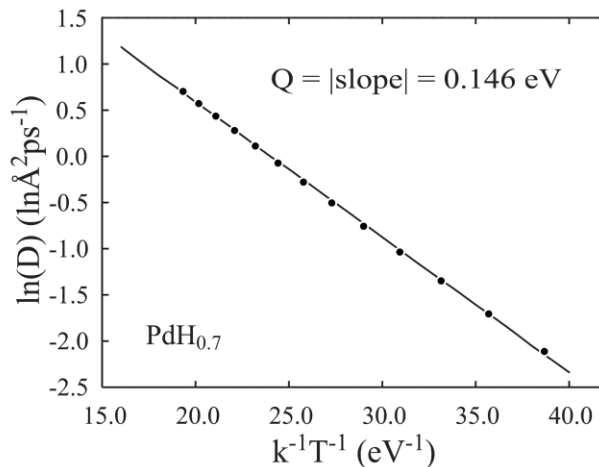
# Time Averaged MD Simulations $\Rightarrow$ Convergence

## Diffusion of Hydrogen in $\text{PdH}_x$

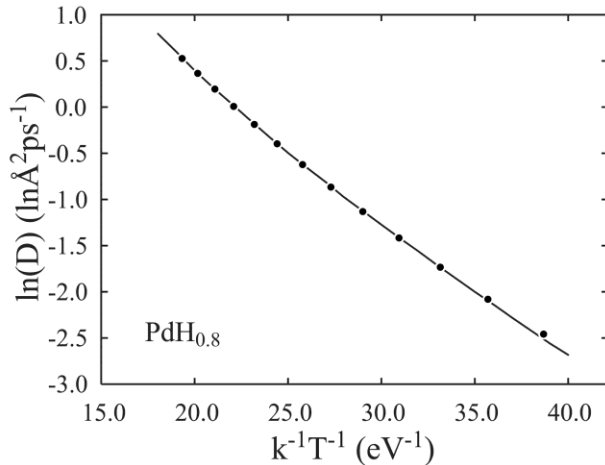
(a) hydrogen composition  $x = 0.4$



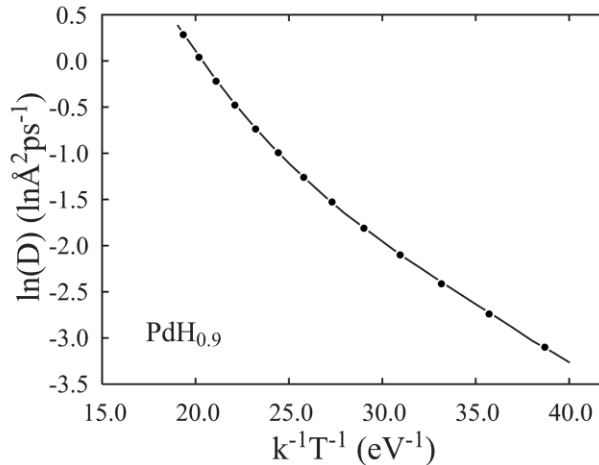
(b) hydrogen composition  $x = 0.7$



(c) hydrogen composition  $x = 0.8$



(d) hydrogen composition  $x = 0.9$



- Negligible error bars
- No time scale issue because error bars are already negligible
- No length scale issues because the computational cell can include all geometries of our problems (e.g., grain boundaries)

# Major Conclusions

Time-averaged molecular dynamics simulations can be used to calculate accurate dislocation core energy and diffusion energy barriers. While the interatomic potential used in the simulations has errors, the simulations do not introduce additional non-negligible errors regardless time and length scales