



# *Computational Challenges in Nuclear and Many-Body Physics*

## *Stockholm, September 15<sup>th</sup> – October 10<sup>th</sup>*

# Combined ab initio-mean field approach to solute-atom diffusion in alloys

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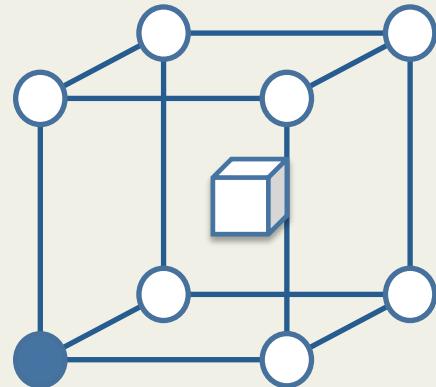
# Outline

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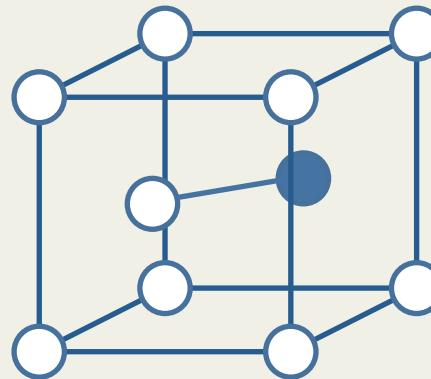
1. Solute diffusion and applications
  2. Onsager matrix (transport coefficients)
  3. First-principles calculations of jump rates
  4. Self-consistent mean field model
  5. Application to bcc Fe-X model dilute alloys
  6. Radiation-induced segregation
  7. Conclusions
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# Solute diffusion in alloys

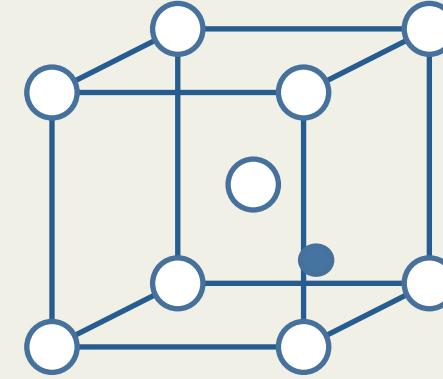
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Vacancy exchange



Dumbbell migration



Foreign interstitial

Diffusion capability depends on:

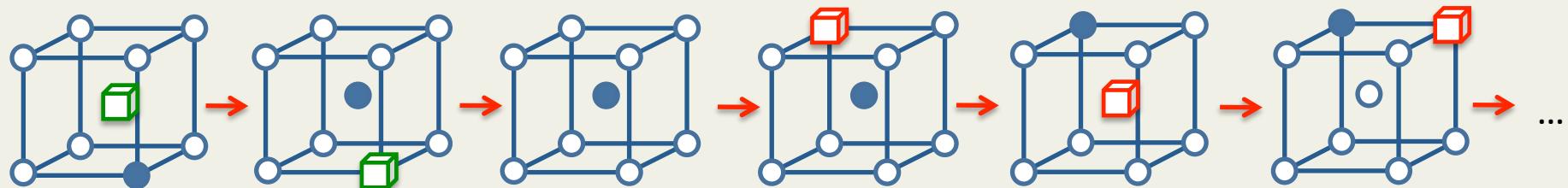
- Stability of the defected configuration (binding energies).
- Transition (jump) rates.

$$P_{config} \propto \exp\left(\frac{-E_{config}^B}{k_B T}\right)$$

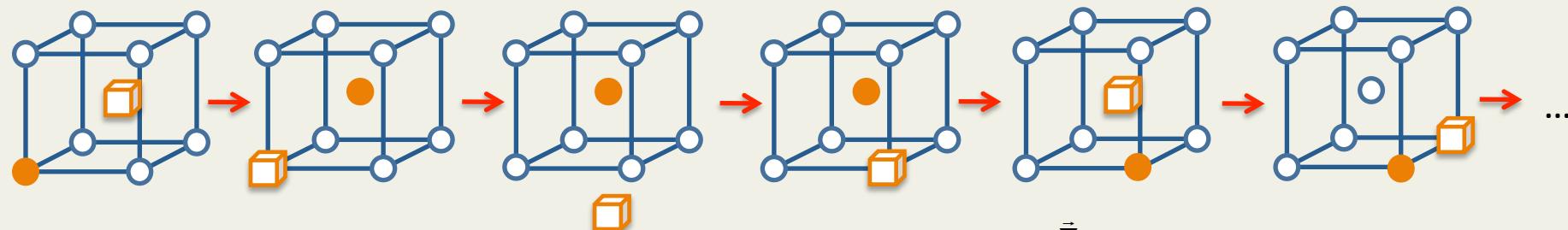
$$\omega = v \exp\left(-\frac{E^M}{k_B T}\right)$$

# Solute diffusion in alloys

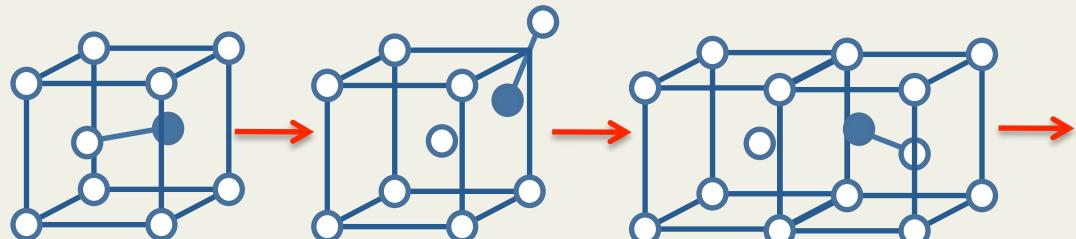
## INVERSE KIRKENDALL MECHANISM



## VACANCY DRAG



## DUMBBELL MECHANISM (rotation-translation)



$\vec{\nabla}\mu_x$   
Defect chemical potential gradient

Experimental difficulties due to:  
... - Slow diffusion processes at low temperatures.  
- No extrapolation from high T in magnetically-ordered systems.  
- Resolution of material analysis techniques.

# Microstructural characterization

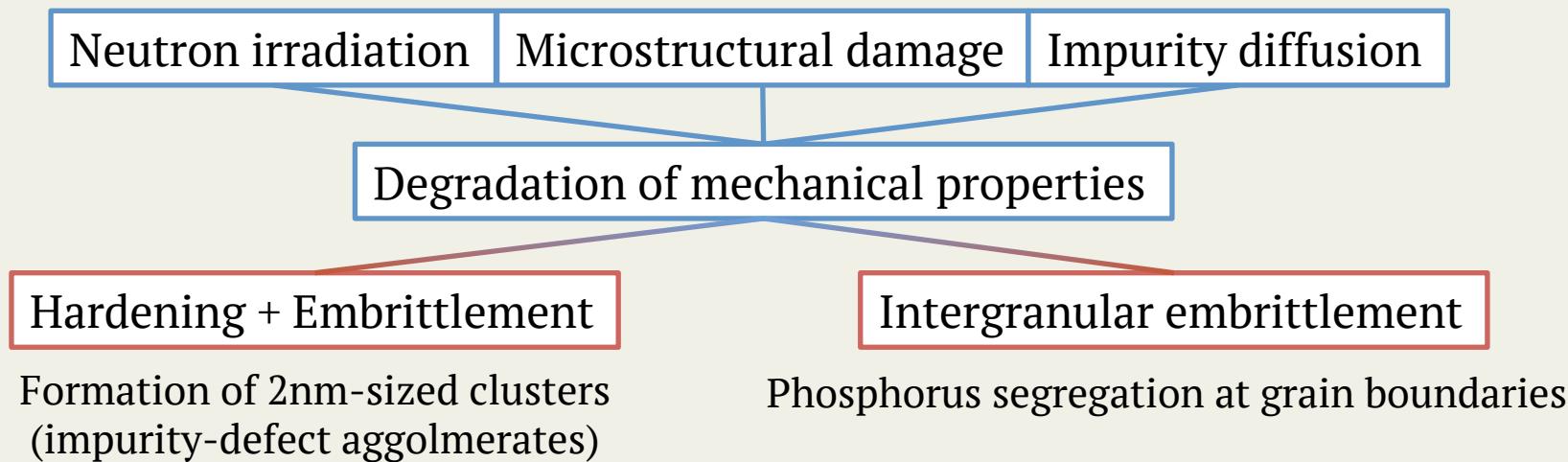
Diffusion mechanisms are important to control many **metallurgical processes** requiring a very precise microstructural characterization.

Examples [1,2] :

- Ad-hoc heat treatments to induce phase separation.
- Enhancement of mechanical properties through formation of hardening phases.

Diffusion mechanisms are also responsible for **degradation of mechanical properties!**

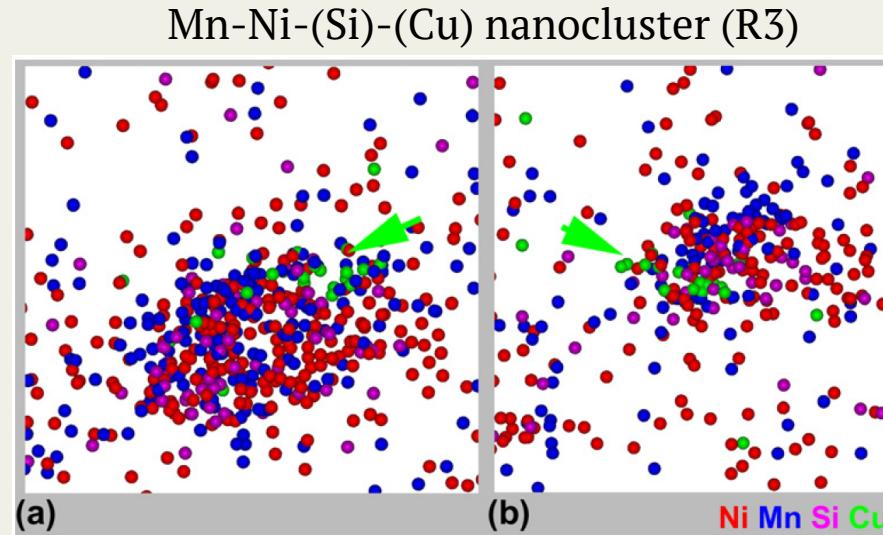
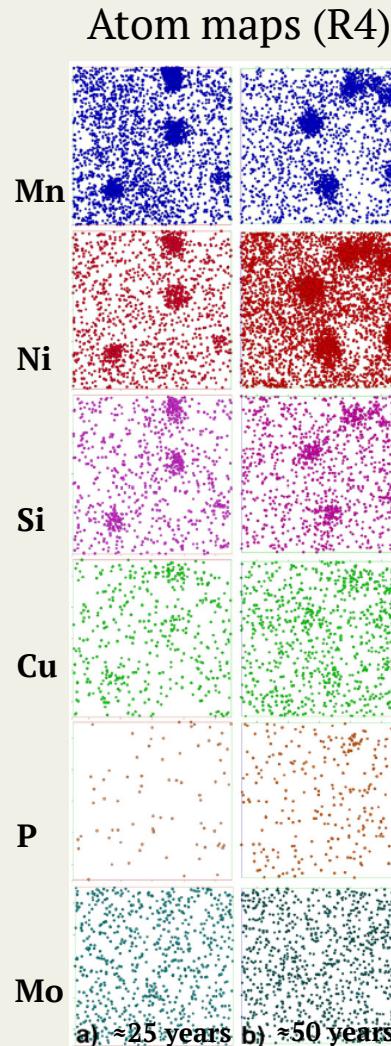
Example: Embrittlement of Reactor Pressure Vessel (RPV) steels in nuclear reactors.



[1] Z. Mao et al., Nat. Mater. 6, 210 (2007).

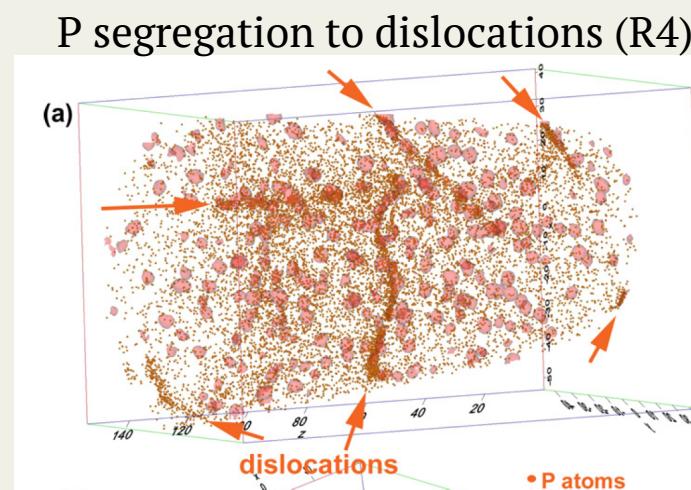
[2] F. Danoix et al., Adv. Eng. Mater. 8, 1202 (2006).

# Embrittlement in RPV steels



Miller et al., JNM 437 (2013)

Ringhals surveillance capsules  
(atom probe tomography)



Mn-Ni-Si rich precipitates

(radiation-induced)

Cu-rich precipitates

(radiation-enhanced)

# Onsager matrix

FICK'S  
LAW

$$J_i = - \sum_{j=1}^N D_{ij} \nabla C_j$$

- Off-diagonal coefficients (symmetric) describe flux correlations.
- Clear separation between thermodynamic and kinetic properties of the system.

ONSAGER'S  
FORMULATION [3]

$$J_i = - \sum_{j=1}^N L_{ij} \nabla \mu_j$$

$$J_A = -L_{AA}^x \nabla \mu_A - L_{AB}^x \nabla \mu_B$$

$$J_B = -L_{BA}^x \nabla \mu_A - L_{BB}^x \nabla \mu_B$$

## FLUX COUPLING

Vacancy drag

Solute and vacancy flowing in the same direction.

$$\frac{-(L_{AB}^V + L_{BB}^V)}{L_{BB}^V} > 0$$

Interstitial transport

Solute transported by dumbbells faster than solvent atoms.

$$L_{AB}^I + L_{BB}^I < L_{BB}^{I,0}$$

# How to compute the $L_{ij}$ 's?

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## EXPERIMENTS

- Low-temperature impediments.
- No off-diagonal coefficients.

## KINETIC MONTE CARLO

- Good for benchmark!
- Difficult with trapping effects.

## MEAN FIELD

- Steady-state solution to **master equation**

$$\frac{dP(n)}{dt} = \sum_{n'} [W(n' \rightarrow n)P(n') - W(n \rightarrow n')P(n)] = 0$$

$P(n)$  = probability of configuration  $n$

$$P(n) \propto \exp\left(-\frac{E(n)}{k_B T}\right)$$

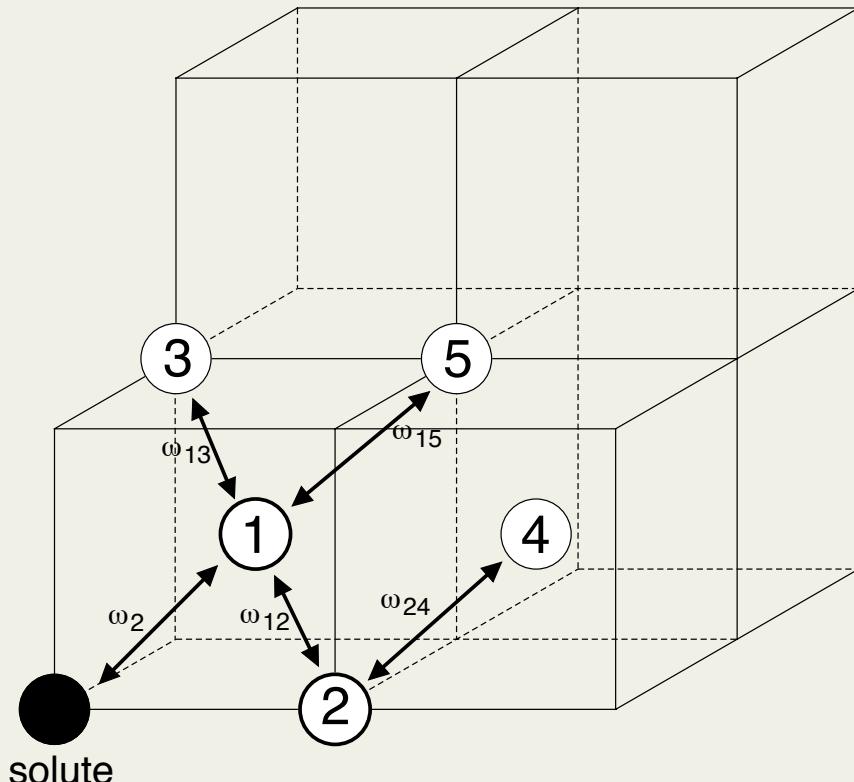
$W(n' \rightarrow n)$  = rate of transition between configuration  $n'$  and  $n$

$$W(n' \rightarrow n) = \omega = v \exp\left(-\frac{E^M}{k_B T}\right)$$

- $W$  depends on the **local chemical environment** around the moving defect!
- Need for interaction range cutoff.

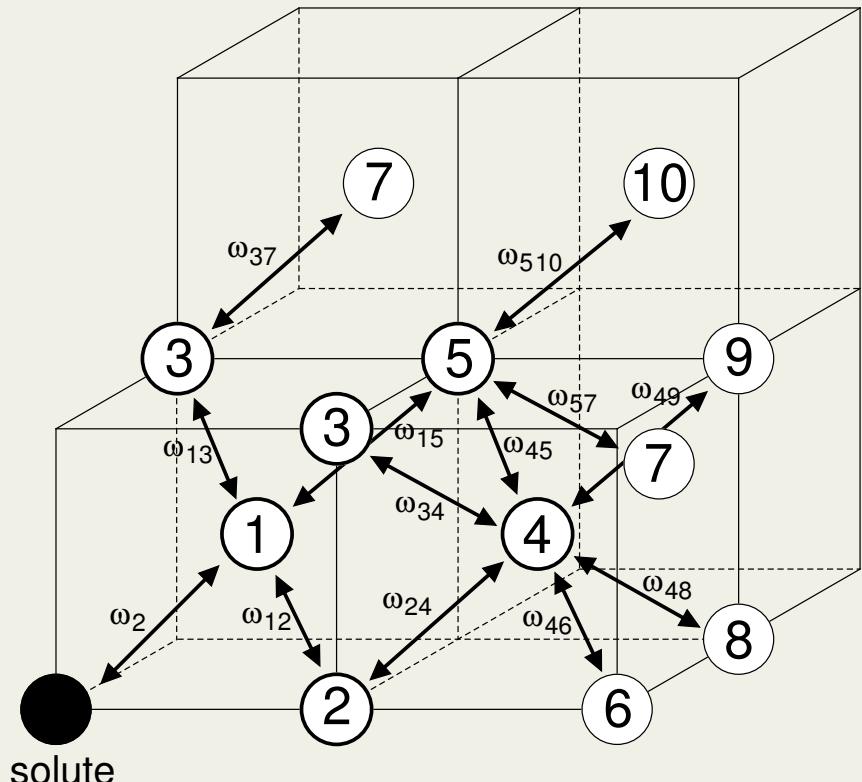
# Multifrequency network in dilute alloys

Vacancy, 2nn model



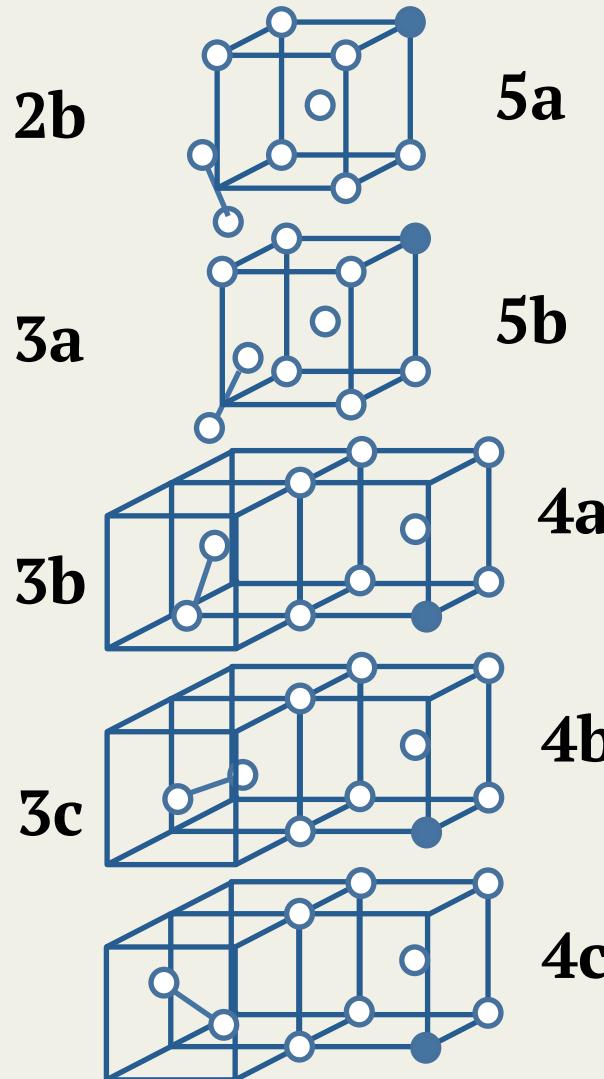
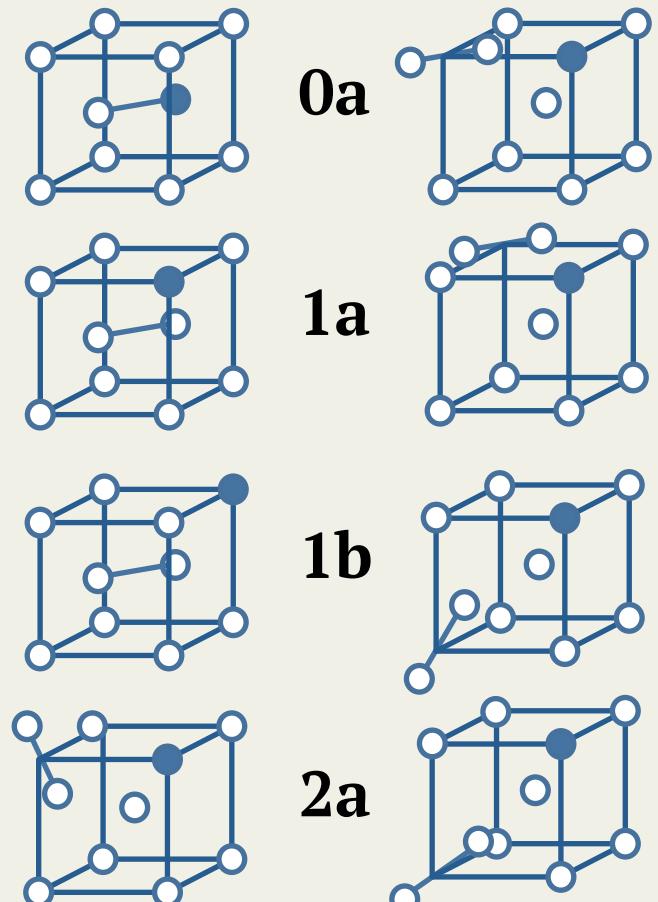
4+2 frequencies

Vacancy, 5nn model [4]

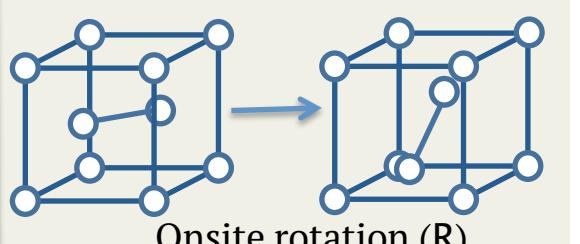
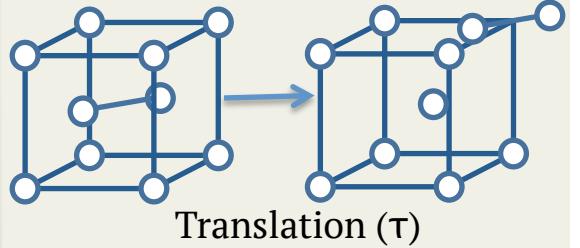
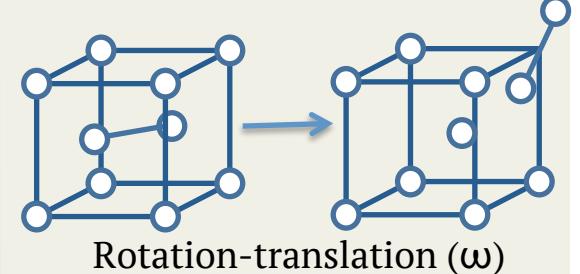


12+2 frequencies

# Multifrequency network in dilute alloys



3 migration modes



# Ab initio methodology

VASP SETTINGS
PAW-PBE method
Spin-polarized calculations
Full-core PAW potentials
Supercell: 128 atoms (vac), 250 atoms (int)
K-point mesh: 3x3x3
Cutoff energy: 300 eV (vac), 350 eV (int)
Refinement of mixing tags to prevent the simulation from getting trapped into a wrong magnetic state (Mn, Si).
Nudged Elastic Band (NEB) method
Phonon calculations (Hessian matrix)

## BINDING ENERGIES

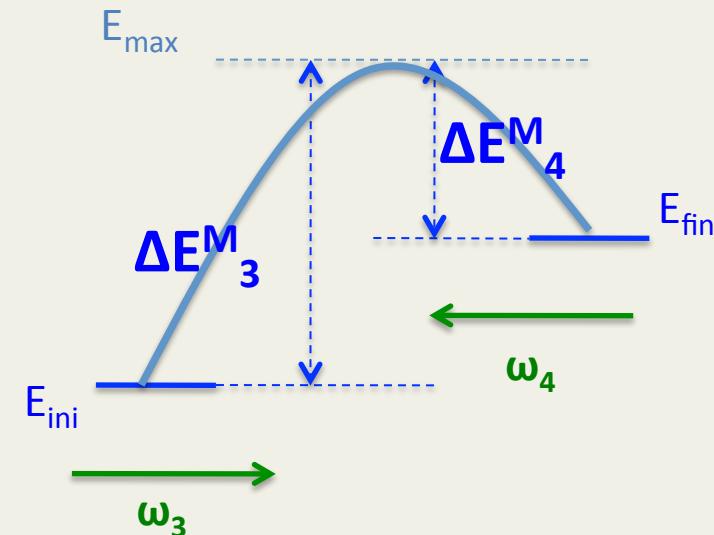
Supercell relaxation at constant volume.

## ATTEMPT FREQUENCIES

(Vineyard's theory<sup>[9]</sup>):

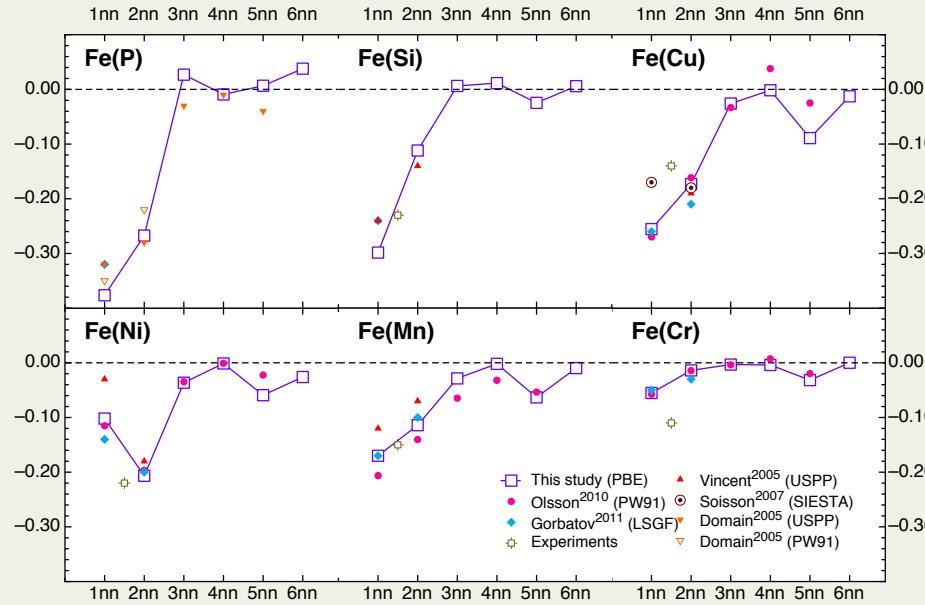
$$\nu = \prod_{j=1}^{N-3} \nu_j^{init} / \prod_{j=1}^{N-4} \nu_j^{saddle}$$

## MIGRATION BARRIERS (NEB)

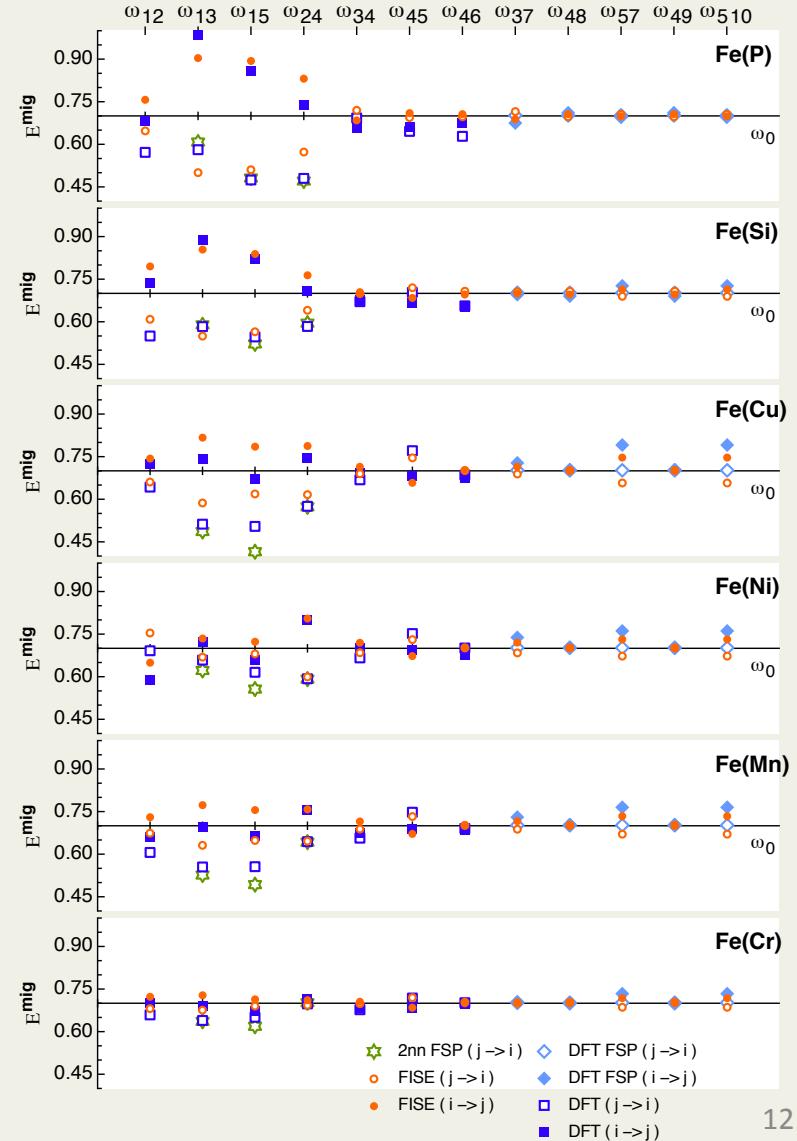


[9] G. H. Vineyard, J. Phys. Chem. Solids 3, 121 (1957).

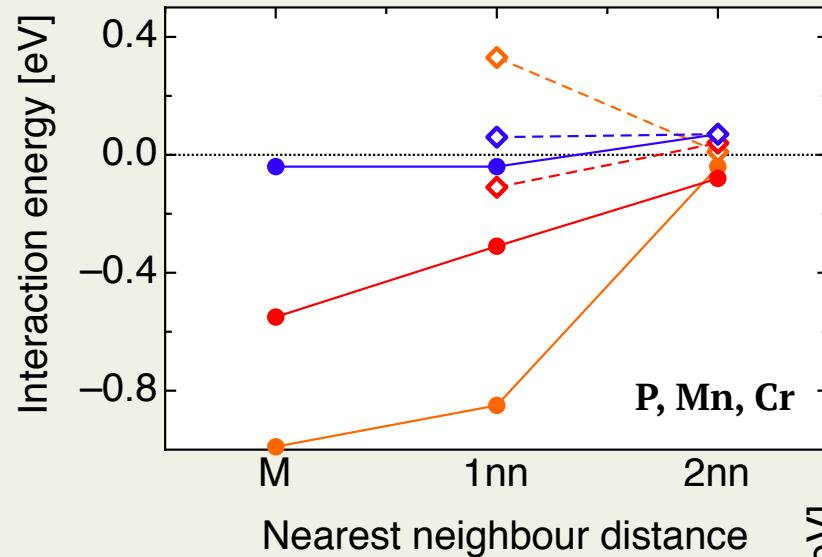
# Ab initio results (V) [4]



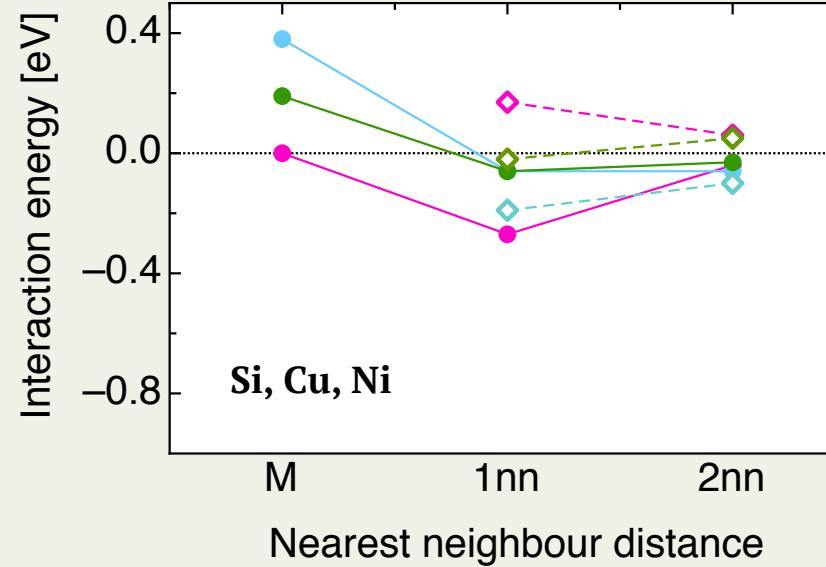
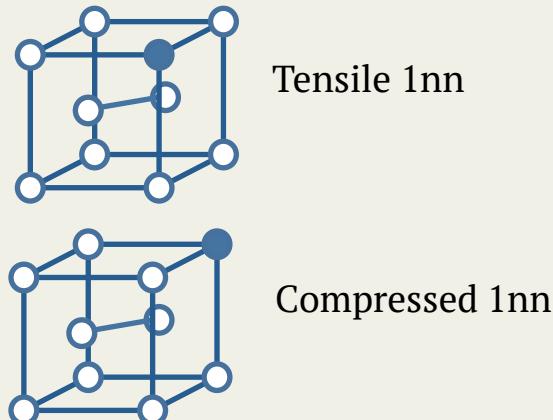
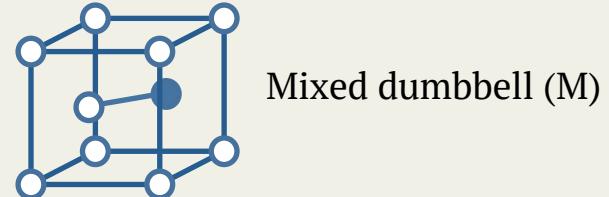
- Solute-vacancy interaction to 5nn.
- Migration barriers converging to background  $\omega_0$  with distance.



# Ab initio results (I)



- P
- ◇ P tens
- Mn
- ◇ Mn tens
- Cr
- ◇ Cr tens



- Si
- ◇ Si tens
- Cu
- ◇ Cu tens
- Ni
- ◇ Ni tens

# Ab initio results (I)

$\omega$  = Rotation-translation

$\tau$  = Translation

R = Onsite rotation

	0a	1a	1b	2a	2b	3b	3c	4b	4c	5b
0a	$\omega, \tau, R$									
1a		R	R	$\omega$	$\omega, \tau$	$\omega, \tau$	$\omega$			
1b	$\omega, \tau$	R	R	$\tau$	$\omega$	$\omega$	$\tau$			$\omega, \tau$
2a		$\omega$	$\tau$		R			$\tau$	$\omega$	
2b		$\omega, \tau$	$\omega$	R	R			$\omega$	$\omega, \tau$	
3b		$\omega, \tau$	$\omega$							
3c		$\omega$	$\tau$							
4b				$\tau$	$\omega$					
4c				$\omega$	$\omega, \tau$					
5b			$\omega, \tau$							

2nn model --> 27 + 3 frequencies ( $\omega_0, \tau_0, R_0$  not shown)

# Self-Consistent Mean Field method [5]

**CONFIGURATION = ENSEMBLE OF OCCUPATION NUMBERS**

$$n = \{n_1^A, n_1^B, \dots, n_1^\nu, n_2^A, n_2^B, \dots, n_2^\nu, \dots\}$$

**MASTER EQUATION**

$$\frac{dP(n)}{dt} = \sum_{n'} [W(n' \rightarrow n)P(n') - W(n \rightarrow n')P(n)]$$

$$P(n) = P_0(n) \cdot P_1(n)$$

**EQUILIBRIUM**

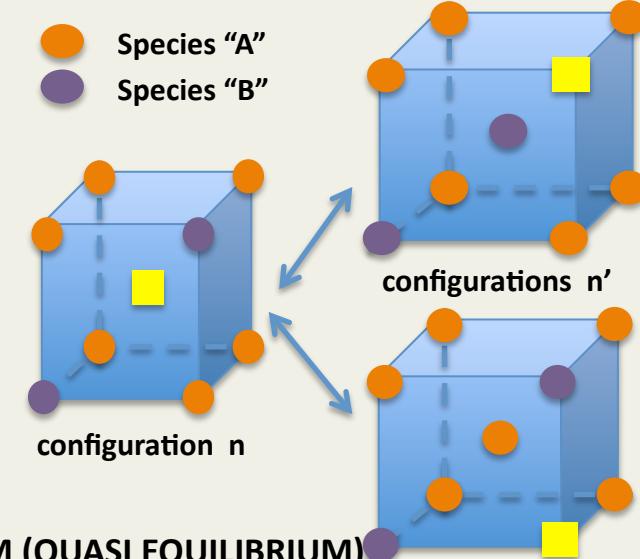
The probability for a state to occur depends on the energy of the state according to the Boltzmann factor.

$$P_0(n) \propto \exp\left(-\frac{E_0(n)}{k_B T}\right)$$

**E<sub>0</sub>(n)** : sum of pair interactions  
(possibly multi-body)

**THERMODYNAMIC INTERACTIONS**

$$n_i^\alpha = \begin{cases} 0 \\ 1 \end{cases}$$



**NON EQUILIBRIUM (QUASI EQUILIBRIUM)**

Small perturbation from equilibrium state.

The variation of energy of the system is given by pair (possibly multi-body) interactions with the same mathematical structure.

**KINETIC INTERACTIONS**

$$P(n) \propto \exp\left(-\frac{E(n)}{k_B T}\right)$$

**UNKNOWN TO BE FOUND!**

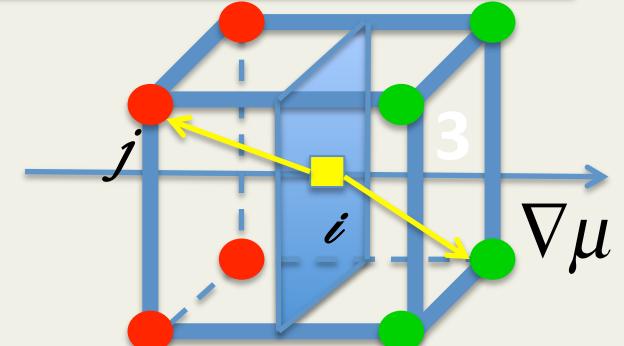
$$E(n) = \frac{1}{2!} \sum_{i \neq j, \alpha, \beta} n_i^\alpha n_j^\beta v_{ij}^{\alpha\beta} + \frac{1}{3!} \sum_{i \neq j \neq k, \alpha, \beta, \gamma} n_i^\alpha n_j^\beta n_k^\gamma v_{ijk}^{\alpha\beta\gamma} + \dots$$

# Example 1: Vacancies

## Example of kinetic interaction

1<sup>st</sup> : Configuration n can change when atom  $\alpha$  jump from site  $i$  to a neighboring site  $s$  occupied by a vacancy.

2<sup>nd</sup> : Configuration n can change when atom  $\beta$  jump from site  $j$  to a neighboring site  $s$  occupied by a vacancy.



Symmetries: bond projection on  $\nabla\mu$

$$\frac{d\langle n_i^\nu n_j^\alpha \rangle}{dt} = 0 = \beta \sum_{s \neq i \neq j, \sigma} \langle n_j^\alpha n_i^\sigma n_s^\nu \hat{\omega}_{is}^{\sigma\nu} \rangle^{(0)} (\mu_i^\sigma - \mu_s^\sigma) + \beta \langle n_i^\alpha n_j^\nu \hat{\omega}_{ji}^{\nu\alpha} \rangle^{(0)} (\mu_i^\alpha - \mu_j^\alpha)$$

$$+ \beta \sum_{s \neq i \neq j, \sigma} \left[ \sum_{k \neq s, \gamma} \langle n_j^\alpha n_i^\sigma n_s^\nu n_k^\gamma \hat{\omega}_{is}^{\sigma\nu} \rangle^{(0)} v_{sk}^{\sigma\gamma} - \sum_{k \neq i, \gamma} \langle n_j^\alpha n_i^\sigma n_s^\nu n_k^\gamma \hat{\omega}_{is}^{\sigma\nu} \rangle^{(0)} v_{ik}^{\sigma\gamma} \right] \text{1st}$$

$$+ \beta \left[ \sum_{k \neq s, \gamma} \langle n_i^\alpha n_j^\nu n_k^\gamma \hat{\omega}_{ji}^{\nu\alpha} \rangle^{(0)} v_{jk}^{\alpha\gamma} - \sum_{k \neq s, \gamma} \langle n_i^\alpha n_j^\nu n_k^\gamma \hat{\omega}_{ji}^{\nu\alpha} \rangle^{(0)} v_{ik}^{\alpha\gamma} \right] \text{2nd}$$

# Example 2: Dumbbells

$$\frac{1}{\beta} \frac{d \langle n_i^{AB_\alpha} n_j^C \rangle}{dt} = \sum_{s \neq i, j, \beta, \sigma} \left( \langle n_j n_s^\gamma \omega_{\sigma A/B} v_{si} \omega_{\sigma A/B}^\beta \mu_i^A \rangle + \sum_{s \neq i, j, \beta, \sigma} \langle n_j^C n_s^\sigma B_\beta n_i^A y_{si}^{\beta\bar{\alpha}} \omega_{\sigma B/A}^{\beta\bar{\alpha}} \rangle (\mu_j^B - \mu_i^B) \right)$$

$$+ \sum_{\beta} \left( \langle n_j^{CA_\beta} n_i^B n_k^A y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/A}^{\beta\bar{\alpha}} \rangle (\mu_j^A - \mu_i^B) + \sum_{s \neq i, j, \beta, \sigma} \left\{ \langle n_j^C n_s^{\sigma A_\beta} n_i^B n_k^A y_{si}^{\beta\bar{\alpha}} \omega_{\sigma A/B}^{\beta\bar{\alpha}} v_{A_\beta} \rangle + \sum_{k \neq i, \gamma} \langle n_j^C n_s^{\sigma A_\beta} n_i^B n_k^\gamma y_{si}^{\beta\bar{\alpha}} \omega_{\sigma A/B}^{\beta\bar{\alpha}} v_{A_\beta} \rangle \right\} \right)$$

$$+ \sum_{s \neq i, j, \beta, \sigma} \left\{ \langle n_j^C n_s^{\sigma B_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma B/A}^{\beta\bar{\alpha}} v_{B_\beta} \rangle - \langle n_j^C n_s^{\sigma B_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma B/A}^{\beta\bar{\alpha}} v_{\sigma B_\beta} \rangle + \sum_{k \neq i, \gamma} \langle n_j^C n_s^{\sigma B_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma B/A}^{\beta\bar{\alpha}} v_{\sigma B_\beta} \rangle + \sum_{k \neq i, \gamma} \langle n_j^C n_s^{\sigma B_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma B/A}^{\beta\bar{\alpha}} v_{B_\beta} \rangle \right\}$$

$$+ \sum_{\beta} \left\{ \langle n_j^{CA_\beta} n_i^B n_k^A y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/A}^{\beta\bar{\alpha}} v_{CA_\beta} \rangle + \sum_{k \neq i, \gamma} \langle n_j^{CA_\beta} n_i^B n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/A}^{\beta\bar{\alpha}} v_{CA_\beta} \rangle - \sum_{k \neq j, \gamma} \langle n_j^{CA_\beta} n_i^B n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/A}^{\beta\bar{\alpha}} v_{jk}^{CA_\beta} \rangle \right\}$$

$$+ \sum_{\beta} \left\{ \langle n_j^{CB_\beta} n_i^A y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/B}^{\beta\bar{\alpha}} v_{AB_\alpha} \rangle - \langle n_j^{CB_\beta} n_i^A y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/B}^{\beta\bar{\alpha}} v_{CB_\beta} \rangle + \sum_{k \neq i, \gamma} \langle n_j^{CB_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/B}^{\beta\bar{\alpha}} v_{ik}^{AB_\alpha} \rangle - \sum_{k \neq j, \gamma} \langle n_j^{CB_\beta} n_i^A n_k^\gamma y_{ji}^{\beta\bar{\alpha}} \omega_{\sigma C/B}^{\beta\bar{\alpha}} v_{jk}^{CB_\beta} \rangle \right\}$$

$$+ \sum_{\beta} \left\{ \langle n_j^C n_i^{AB_\beta} v_{R_\beta}^{\beta\bar{\alpha}} \omega_{\sigma R}^{AB_\beta} v_{AB_\beta} \rangle - \langle n_j^C n_i^{AB_\beta} v_{R_\beta}^{\beta\bar{\alpha}} \omega_{\sigma R}^{AB_\beta} v_{AB_\beta} \rangle + \sum_{J_i \rightarrow s} \langle n_j^C n_i^{AB_\beta} n_k^\gamma v_{R_\beta}^{\beta\bar{\alpha}} \omega_{\sigma R}^{AB_\beta} v_{ik}^{AB_\alpha} \rangle - \sum_{(\alpha, \beta, \sigma, \pi), \gamma} \langle n_j^C n_i^{AB_\beta} n_k^\gamma v_{R_\beta}^{\beta\bar{\alpha}} \omega_{\sigma R}^{AB_\beta} v_{ik}^{AB_\alpha} \rangle \right\} = 0$$

Solve system of equations:

$$\vec{T} \cdot \vec{V}_{ij} = \vec{b}(\nabla \mu_A, \nabla \mu_B)$$

$$(J_A = -L_{AA} \nabla \mu_A - L_{AB} \nabla \mu_B)$$

Write down flux equations:

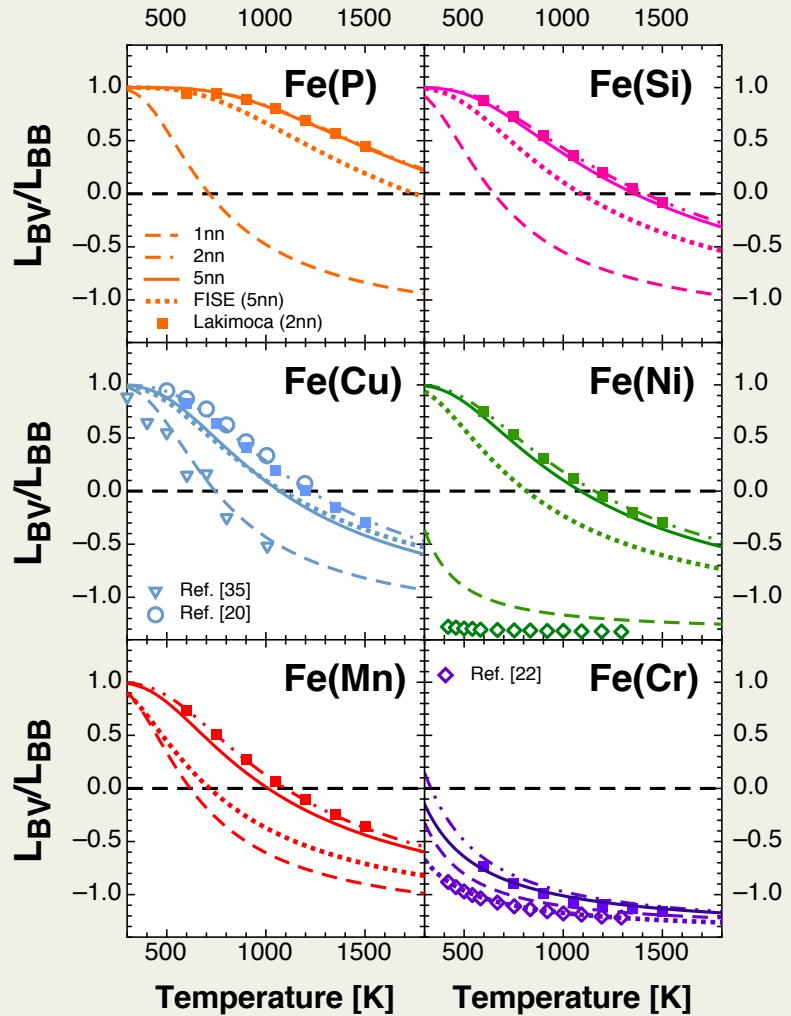
$$J_{i \rightarrow s}^A = -\beta l_A^{(0)} (\mu_s^A - \mu_i^A) - \beta \sum_{(\alpha, \beta, \sigma, \pi), \gamma} \left[ l_A^{(1)} v_{\sigma A_\alpha} + l_A^{(2)} (\gamma) v_{ik}^{\sigma A_\alpha \gamma} \right]$$

Automatic Matlab routines were developed at CEA<sup>[6]</sup> and KTH<sup>[7]</sup>.

[6] T. Garnier *et al.*, PRB **88**, 134201 (2013).

[7] L. Messina *et al.*, to be submitted to PRB [2014].

# Results: Vacancy drag [4]

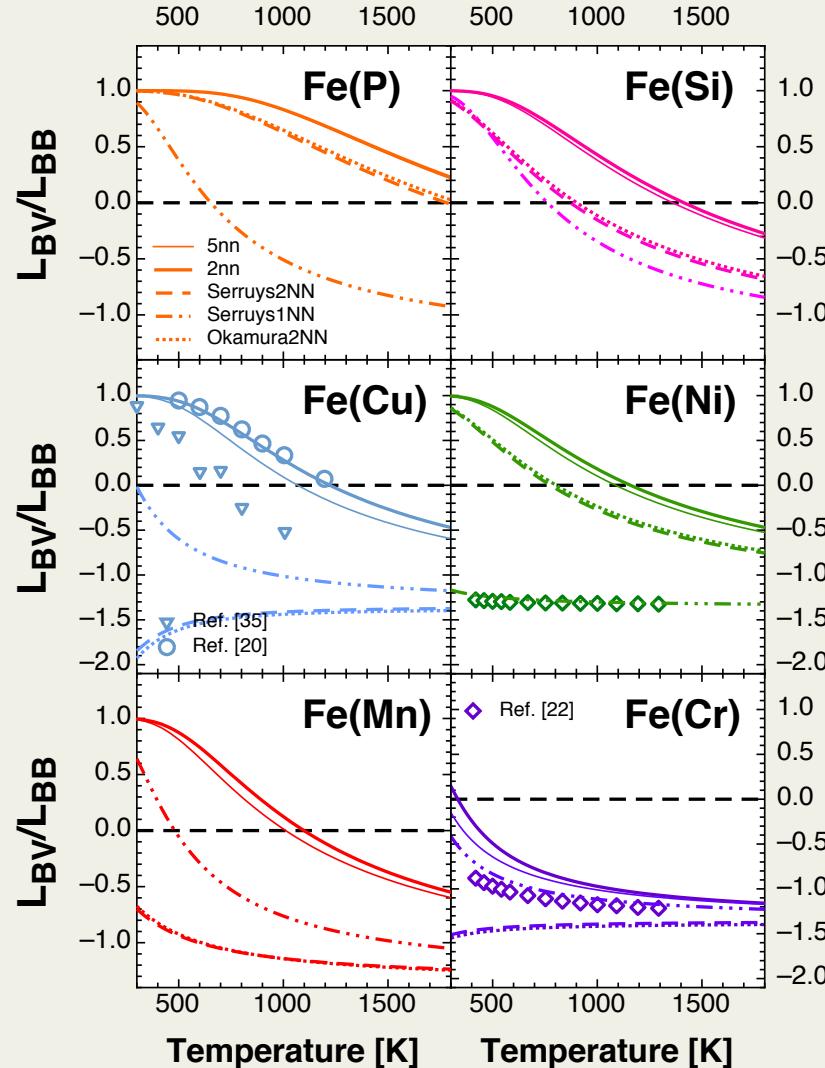


$$\frac{L_{BV}}{L_{BB}} > 0$$

- Vacancy drag occurring at low temperature for all solutes except Cr.
- Perfect benchmarking by KMC.
- Possibility of Ni, Si and Cu drag towards Mn-loop nuclei is confirmed.
- Contradicting previous study in FeNi<sup>[8]</sup>.
- Necessity of 2nn model in BCC.
- 5nn interaction negligible.

# Results: Solute diffusion coefficients

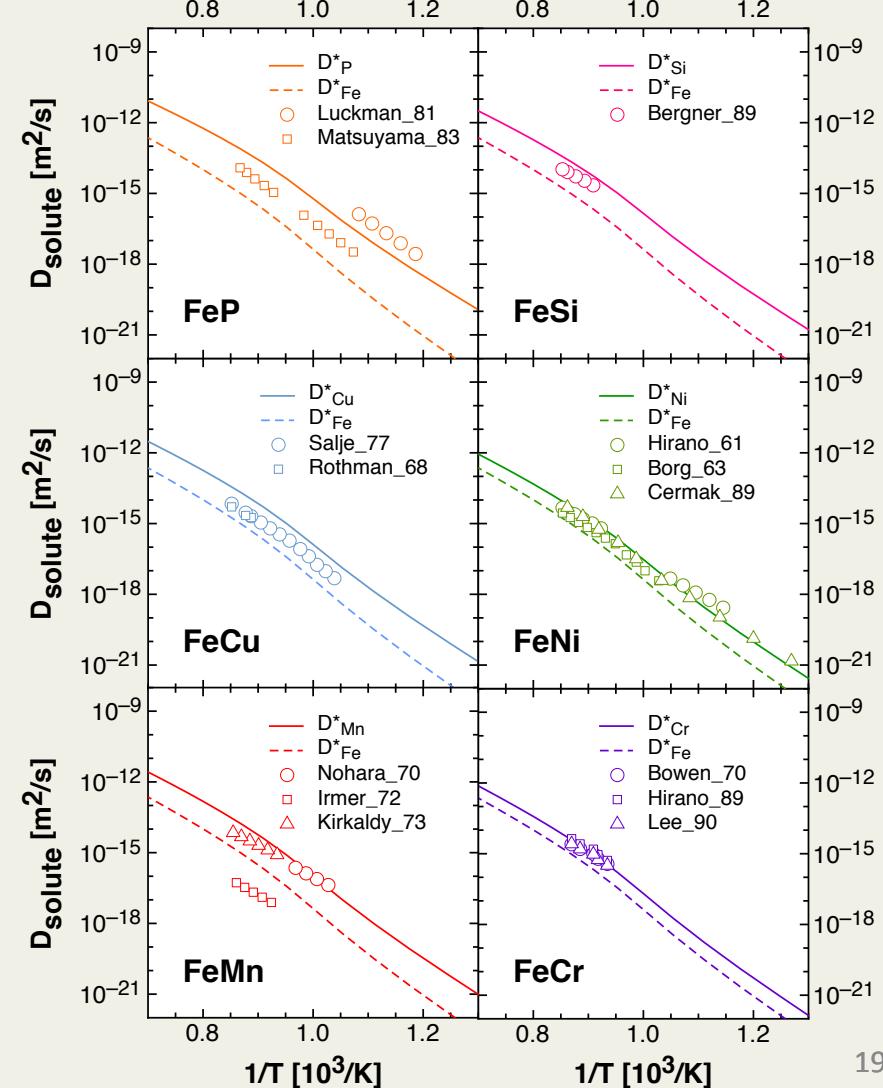
## Comparison with previous multifrequency models



[4] L. Messina *et al.*, PRB **90**, 104203 (2014).

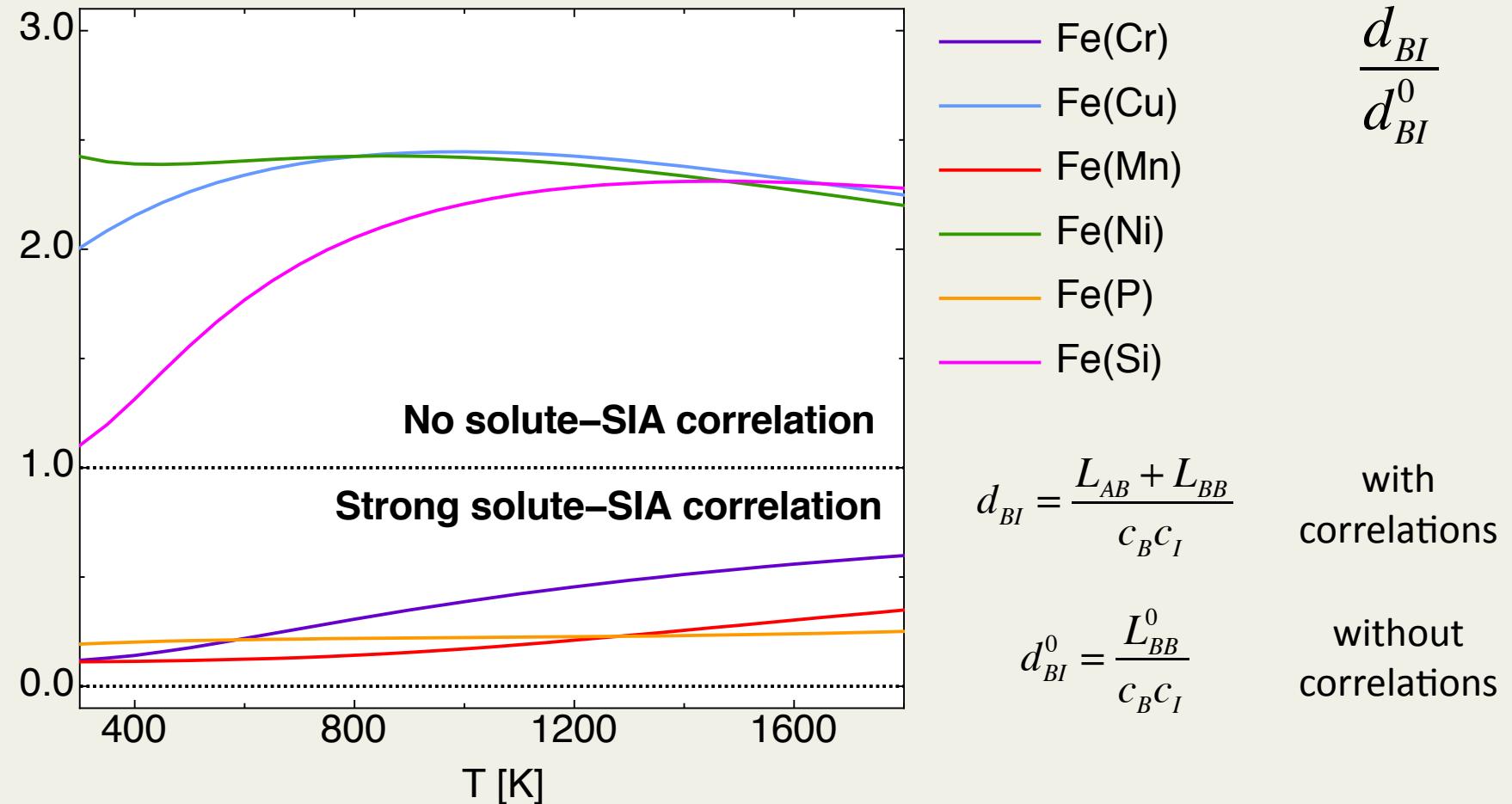
$$D_B^* = k_B T \frac{L_{BB}}{n c_B}$$

[4] Tracer diffusion coefficients  $D_B^*$



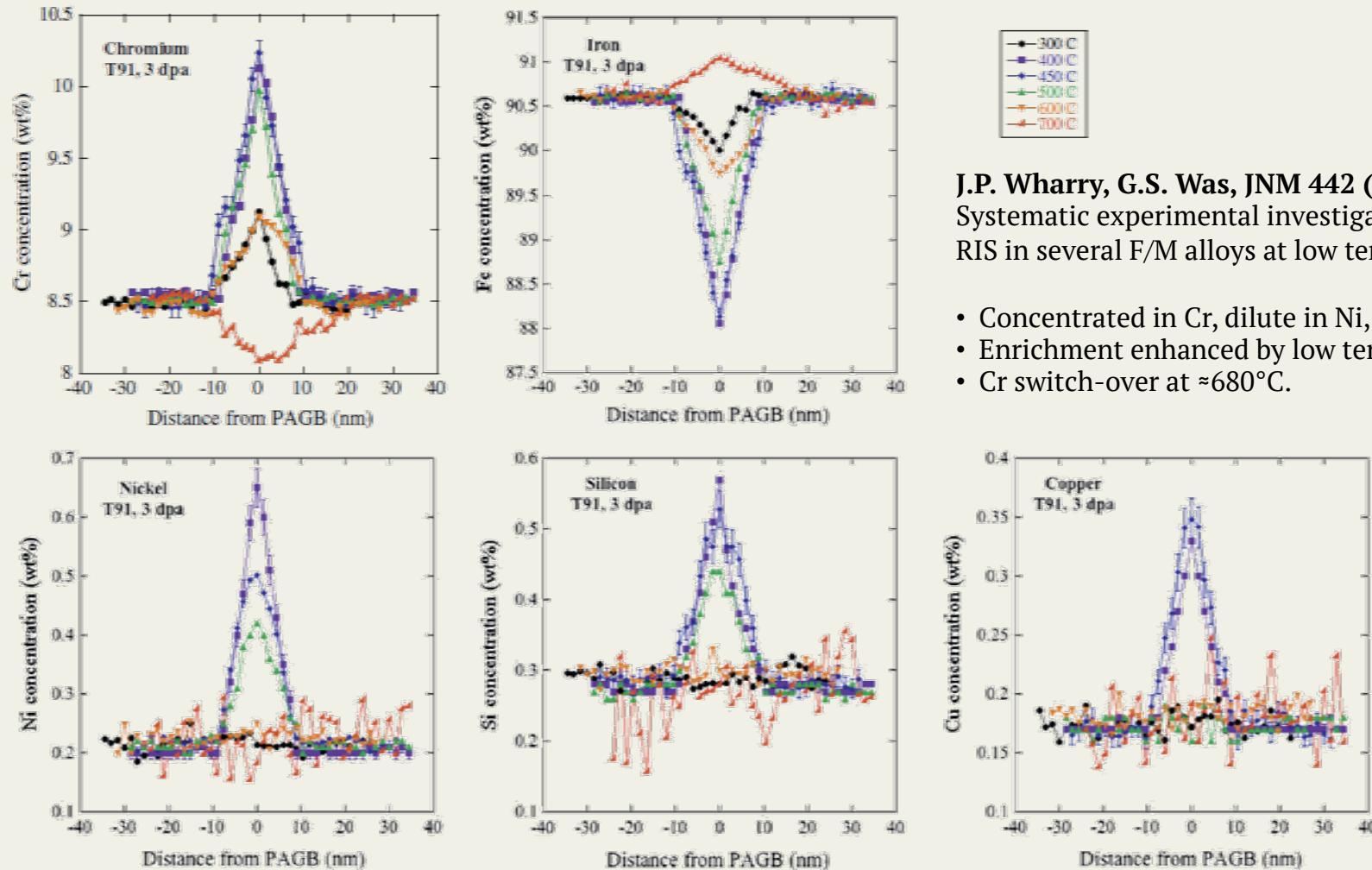
# Results: Interstitial diffusion

Ratio of correlated to uncorrelated solute diffusion coefficient.



# Radiation-induced segregation (RIS)

Enrichment of solute atoms at defect sinks (grain boundaries, dislocations, precipitates).



J.P. Wharry, G.S. Was, JNM 442 (2013)  
Systematic experimental investigation of  
RIS in several F/M alloys at low temperature.

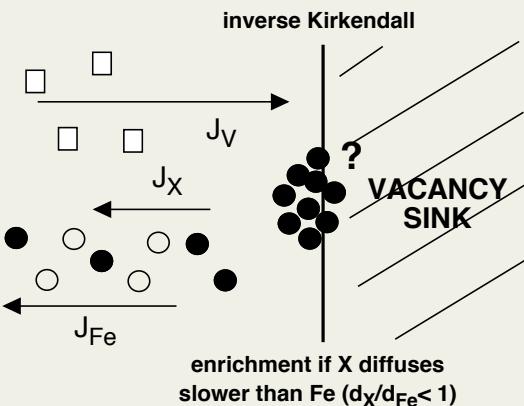
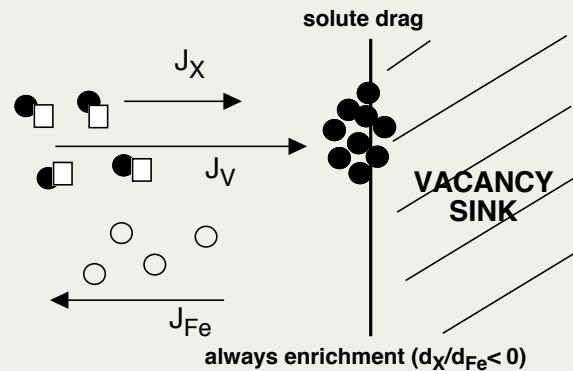
- Concentrated in Cr, dilute in Ni, Si, Cu.
- Enrichment enhanced by low temperature.
- Cr switch-over at  $\approx 680^\circ\text{C}$ .

# Radiation-induced segregation (RIS)

Enrichment/Depletion tendencies determined by solute-defect flux coupling!

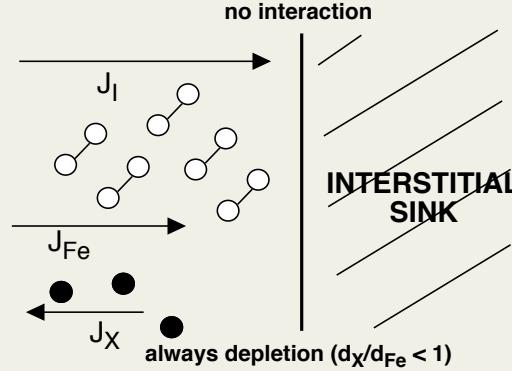
$$J_i = - \sum_{j=1}^N L_{ij} \nabla \mu_j$$

VACANCY FLUX



$$J_B = 0, J_V = J_I \text{ (steady-state conditions)}$$

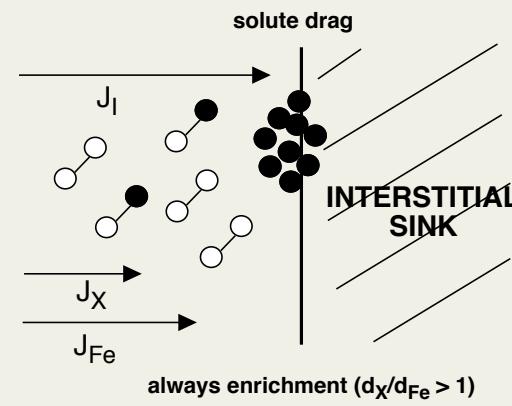
INTERSTITIAL FLUX



$$\frac{\nabla c_B}{\nabla c_V} = \frac{c_A c_B d_{AV} d_{AI}}{(c_B d_{BI} D_A + c_A d_{AI} D_B)} \left( \frac{d_{BV}}{d_{AV}} - \frac{d_{BI}}{d_{AI}} \right)$$

$$\frac{d_{BV}}{d_{AV}} = \frac{L_{AB}^V + L_{BB}^V}{c_B (L_{AA}^V + L_{AB}^V)}$$

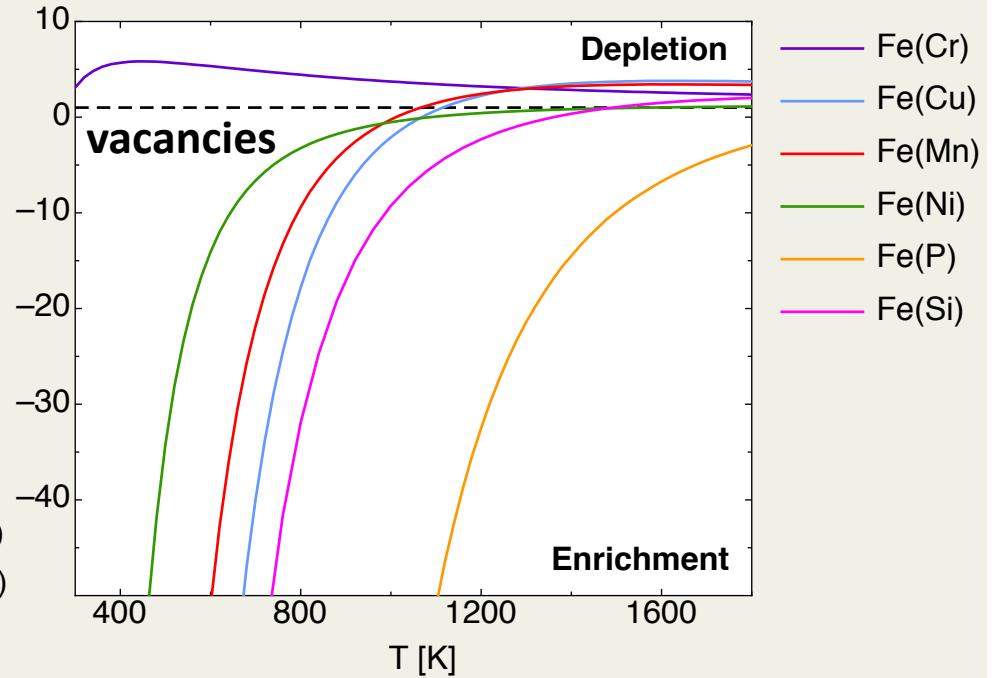
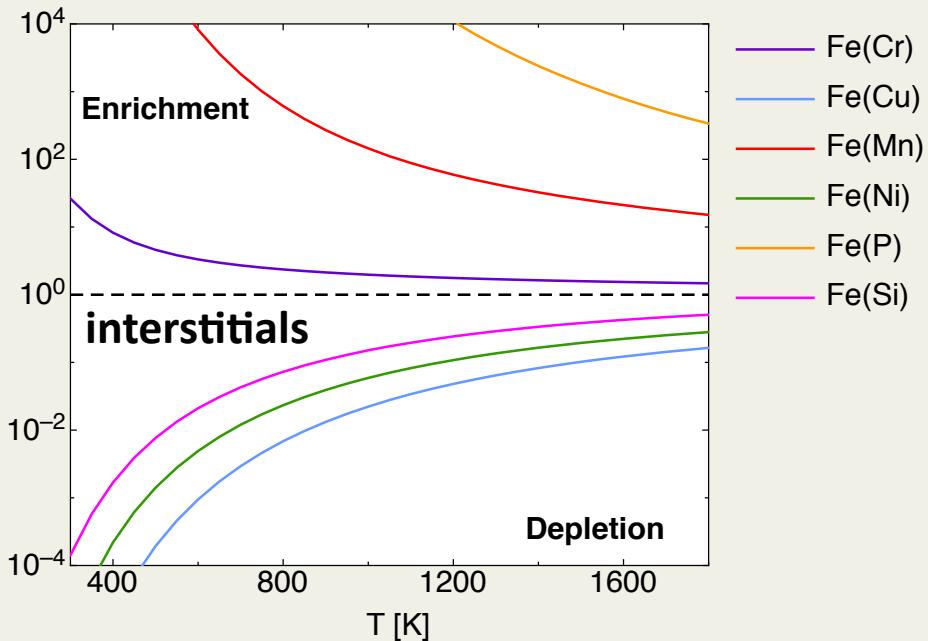
$$\frac{d_{BI}}{d_{AI}} = \frac{L_{AB}^I + L_{BB}^I}{c_B (L_{AA}^I + L_{AB}^I)}$$



# RIS tendencies

General trends:

- Enrichment at low T (vacancy drag).
- Fe(Cr) system very close to switch point at all T.



# Summary by impurity

	Vacancy diffusion	Interstitial diffusion	Dominant mechanism*	RIS tendency
<b>Cr</b>	no drag	yes	in competition	V: Depletion I: Enrichment
<b>Cu</b>	drag T < 930 °C	no	vacancies	V: Enrichment I: Depletion
<b>Mn</b>	drag T < 825 °C	yes	interstitials	V: Enrichment I: Enrichment
<b>Ni</b>	drag T < 887 °C	no	vacancies ( $\approx$ )	V: Enrichment I: Depletion
<b>P</b>	drag at any T	yes	interstitials	V: Enrichment I: Enrichment
<b>Si</b>	drag T < 1141 °C	no	vacancies ( $\approx$ )	V: Enrichment I: Depletion

\* Inferred by comparing magnitude of diffusion coefficient ratios  $d_{BV}/d_{AV}$  and  $d_{BI}/d_{AI}$ .

# Conclusions

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- Theoretical model to investigate and predict solute transport phenomena and solute-defect flux coupling, so to better understand diffusion processes leading to wanted or unwanted changes of local chemical composition in alloys.
- Very flexible and general method, applicable to many sorts of crystal structures and migrating objects (defect clusters, foreign interstitials, etc..).
- Exact transport coefficients are calculated through a mean field method by making use of accurate first principle calculations.
- Main findings
  - a) Vacancy drag on all solutes but Cr, enhanced by low temperatures.
  - b) Interstitial transport for Cr, P, Mn – not for Si, Cu, Ni.
  - c) Vacancy-driven diffusion for Si, Cu, (Ni); interstitial-driven for P, Mn; both for Cr.
  - d) Enrichment of solutes at grain boundaries and dislocations.
- Solid theoretical modelling of mechanisms for embrittling nanofeature formation in RPV steels.

# Thanks for your attention!

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