

# Spatially resolved simulation of damage accumulation in nanocrystalline metals

Aaron Dunn<sup>1</sup>

Rémi Dingreville<sup>2</sup>

Enrique Martínez<sup>3</sup>

Laurent Capolungo<sup>1</sup>

<sup>1</sup>Georgia Institute of Technology

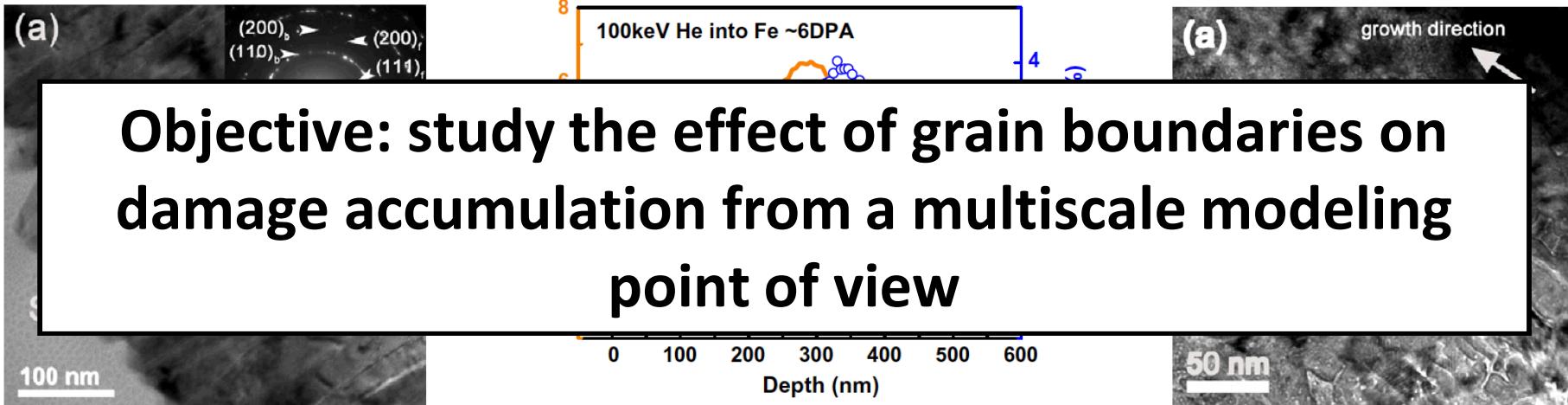
<sup>2</sup>Sandia National Laboratories

<sup>3</sup>Los Alamos National Laboratory

# Outline

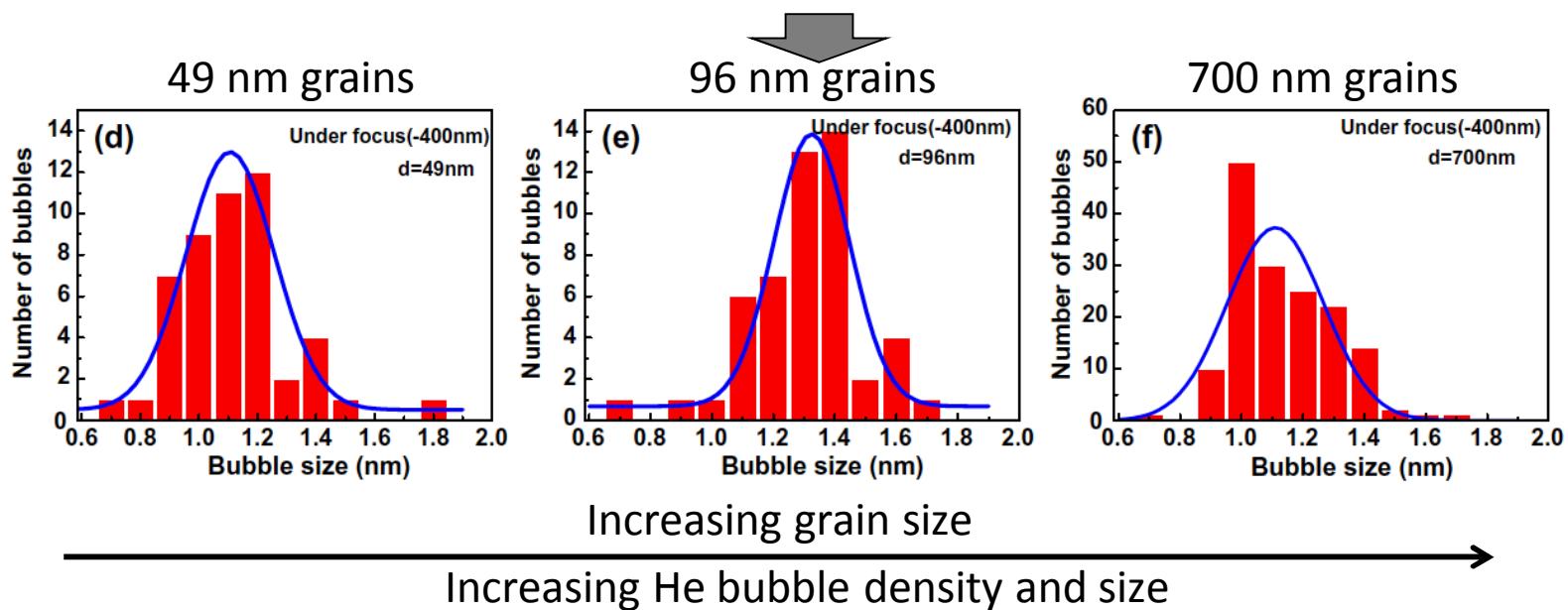
1. Motivation: radiation damage in nanostructured metals
2. Spatially Resolved Stochastic Cluster Dynamics (SRSCD): an efficient computational tool for simulating damage accumulation
3. Damage accumulation in polycrystalline Fe: effect of grain size
4. Impact of grain boundary defect behaviors on defect accumulation and sink efficiency: multivariate statistical analysis
  - Two-variable studies
  - Principal Component Analysis

# Radiation damage in nanostructured metals



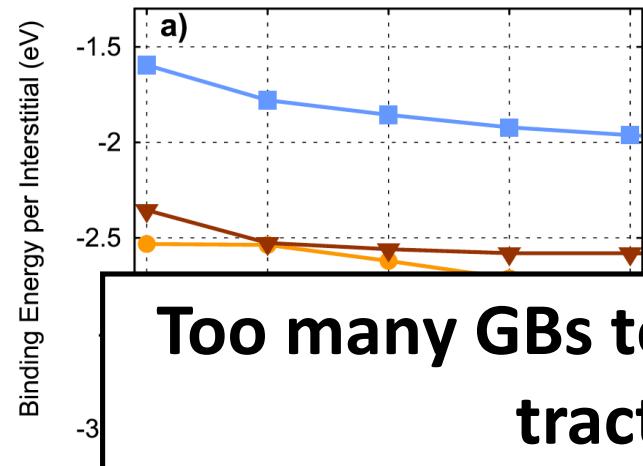
Helium ion irradiation of nanocrystalline Fe thin films - He bubble growth

Yu et al. (2012)



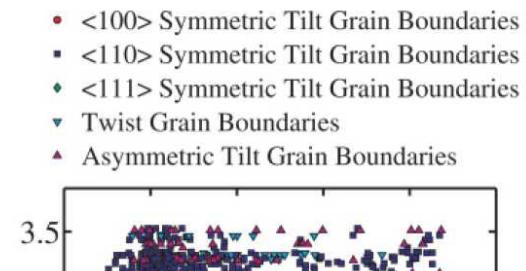
# Defect behaviors at grain boundaries

Diffusion and clustering inside GBs

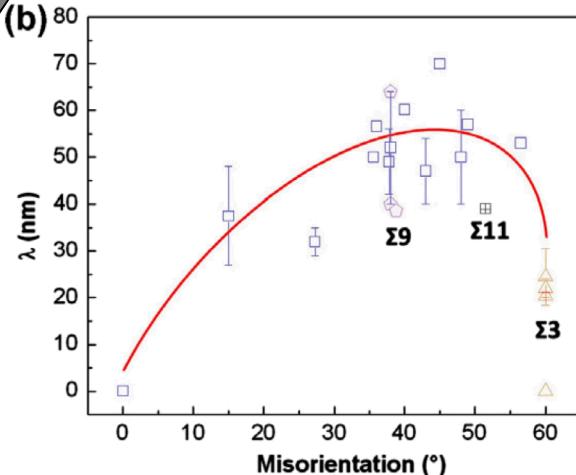
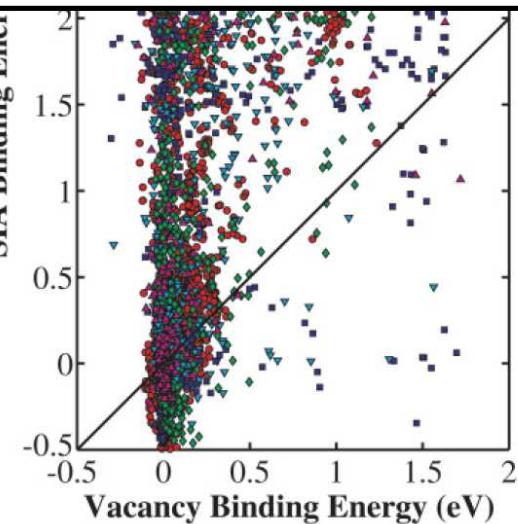
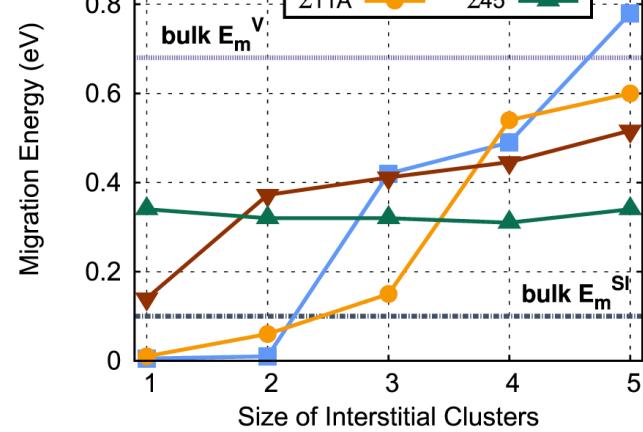
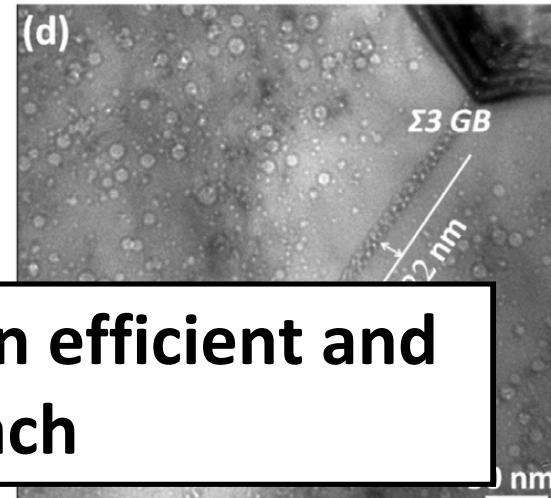


Too many GBs to include all types in an efficient and tractable modeling approach

Emission from GBs



Denuded zone formation



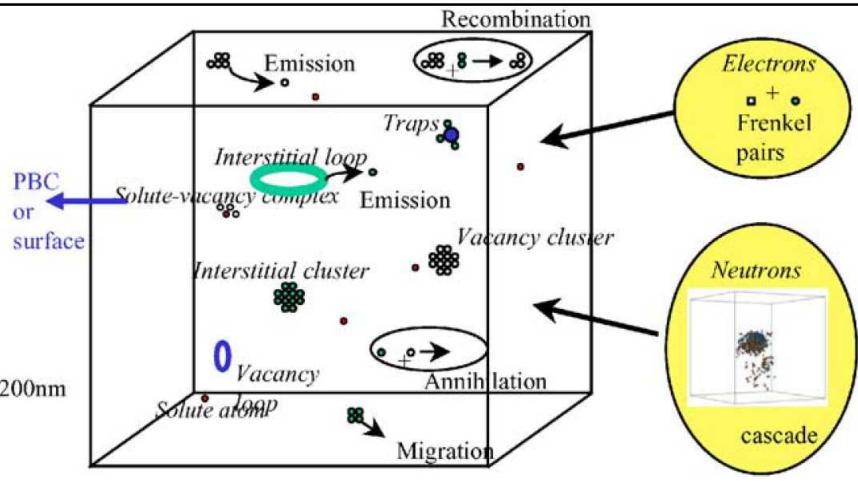
Uberuaga et al. (2015)

Tschopp et al. (2012)

Han et al. (2012)

# Common Methods for Simulating Radiation Damage Accumulation

## Object Kinetic Monte Carlo (OKMC)



Domain et al. (2004)

- Defects placed inside simulation volume
- Allowed reactions defined by user
- KMC algorithm used to choose reactions and advance time

## Cluster Dynamics (CD)

$$\begin{aligned}\frac{dC_v(t)}{dt} = & G_{NRT}(1 - \varepsilon_r)(1 - \varepsilon_{vcl}) \\ & - \left[ \mu_R D_i C_i(t) C_v(t) + Z_v^d \rho D_v (C_v(t) - C_{v0}) + \sum_{x=2}^{\infty} P_{icl}(x) f_{icl}(x, t) \right] \\ & - [P_{vcl}(1) f_{vcl}(1, t) - (Q_{vcl}^v(2) + Q_{vcl}^i(x)) f_{vcl}(2, t)] \\ & - \sum_{x=1}^{\infty} (P_{vcl}(x) f_{vcl}(x, t) - Q_{vcl}^v(x+1) f_{vcl}(x+1, t)),\end{aligned}$$

Stoller et al. (2008)

- Rate equations for concentrations of defect types
- Defects assumed homogeneously distributed in space
- Limited complexity of model
- Can simulate large doses / times

**Traditional OKMC and CD methods do not explicitly include grain boundaries**

# Spatially Resolved Stochastic Cluster Dynamics (SRSCD)

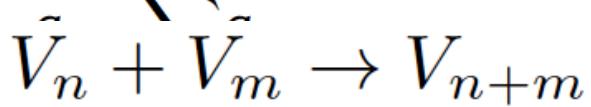
Solving rate equations in a kinetic Monte Carlo setting (Marian and Bulatov, 2011):

1. Choose volume element size and convert all rate equations to number equations by multiplying by  $V/\Omega$ :

$$\left(\frac{dC}{dt}\right) \left(\frac{V}{\Omega}\right) = \frac{dN}{dt}$$

1. Treat integer numbers of defects and compile the rates  $a_\mu$  for all allowed reactions  $\mu$
2. Find the total reaction rate  $a$  inside the volume element

Example: reaction rate for vacancy clustering



3.  $\omega(n^{\frac{1}{3}} + m^{\frac{1}{3}})(D_{Vn} + D_{Vm})N_{Vn}(t)N_{Vm}(t)\frac{\Omega}{V}$  se reaction:

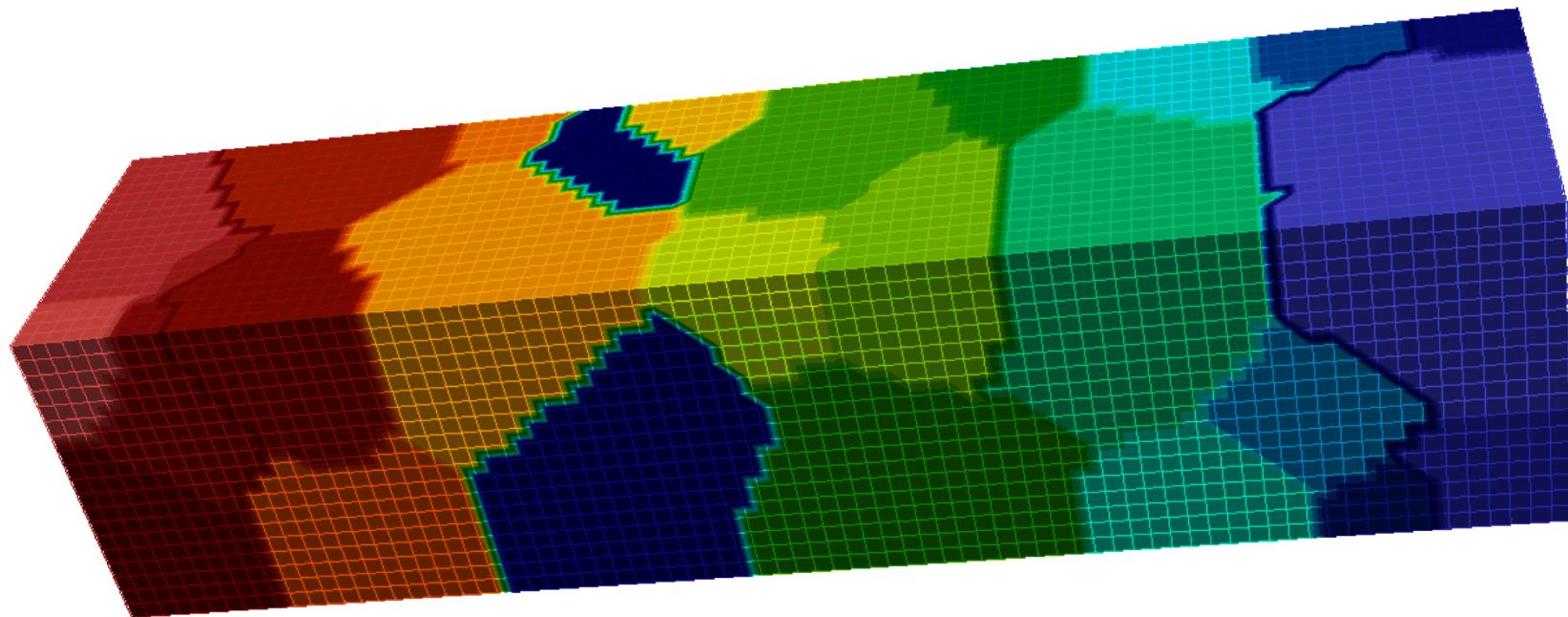
$$\tau = \frac{1}{a} \ln \left( \frac{1}{r_1} \right) \quad \sum_{v=1} a_v < r_2 a < \sum_{v=1} a_v$$

4. Spatial resolution determined by volume element size

- **Benefits:** computationally efficient while including complex defects and reactions

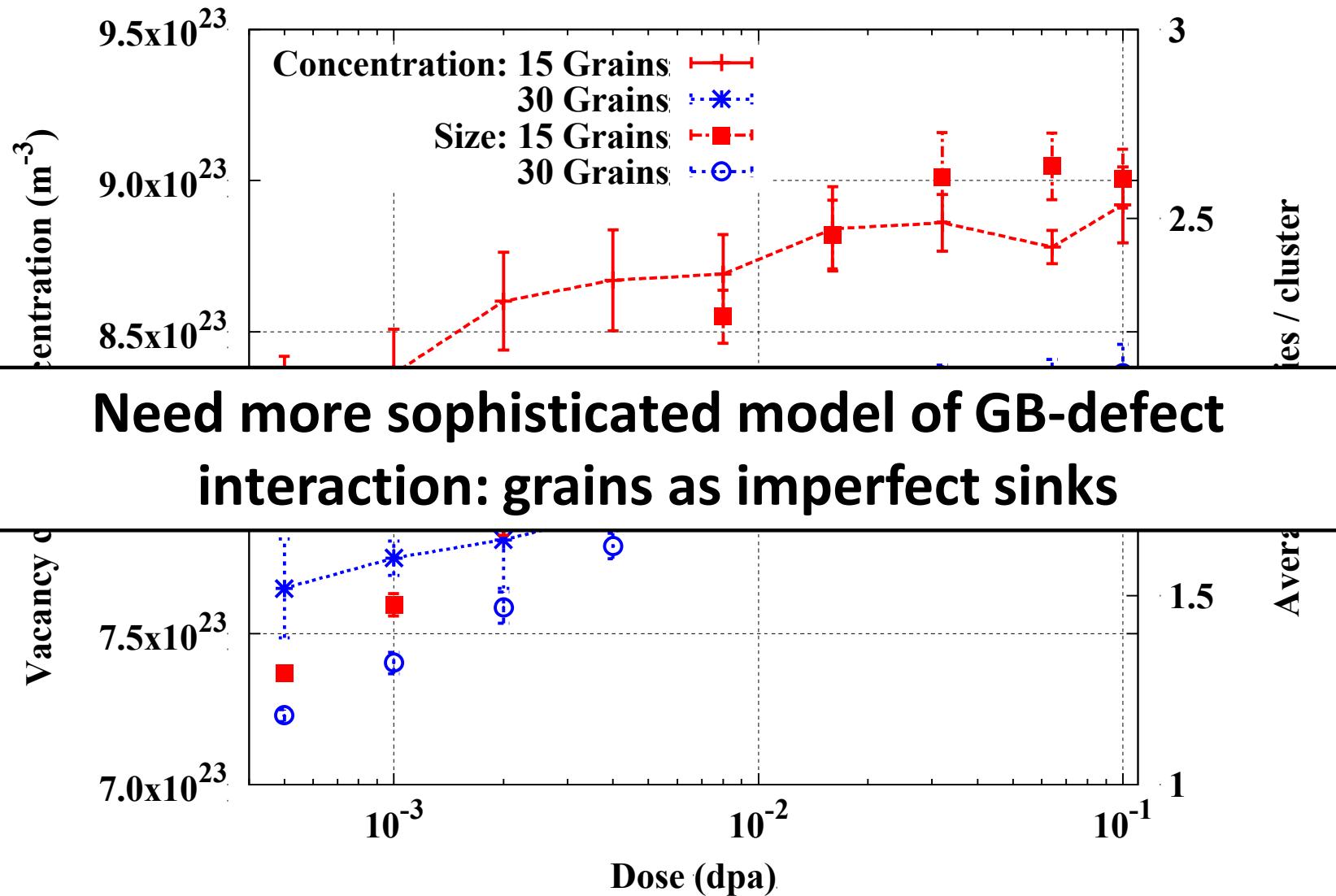
# First approximation: treating grain boundaries as perfect sinks

- Uniform, room temperature Frenkel pair implantation in Fe at  $7 \times 10^{-7}$  dpa s<sup>-1</sup> to a total dose of  $10^{-1}$  dpa
- Two structures: 15 grains and 30 grains
- Total simulation volume: 400 nm x 100 nm x 100 nm, 5 nm elements
- Assume all grain boundaries are perfect sinks



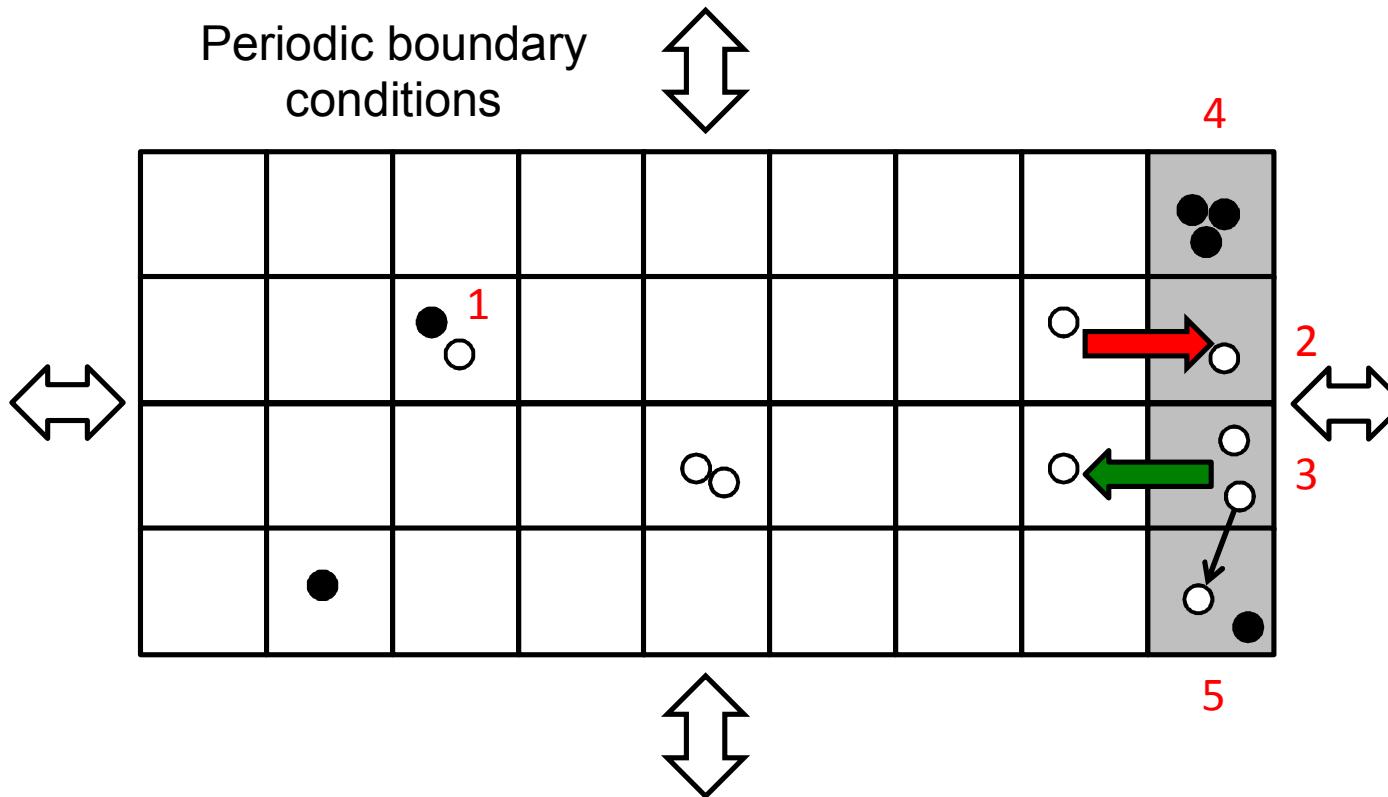
Polycrystalline microstructure. Colors represent grain ID number.

# Effect of Grain Size on Damage Accumulation



- Reproduced experimental trend of Yu et al. (2012)

# Strategy for investigating defect behaviors in grain boundaries



2-D schematic of simulation layout for investigating effect of grain boundary defect parameters on sink efficiency

- Diffusion rates and cluster binding energies on GB treated as an unknown
- Binding energy for emission from GB treated as an unknown

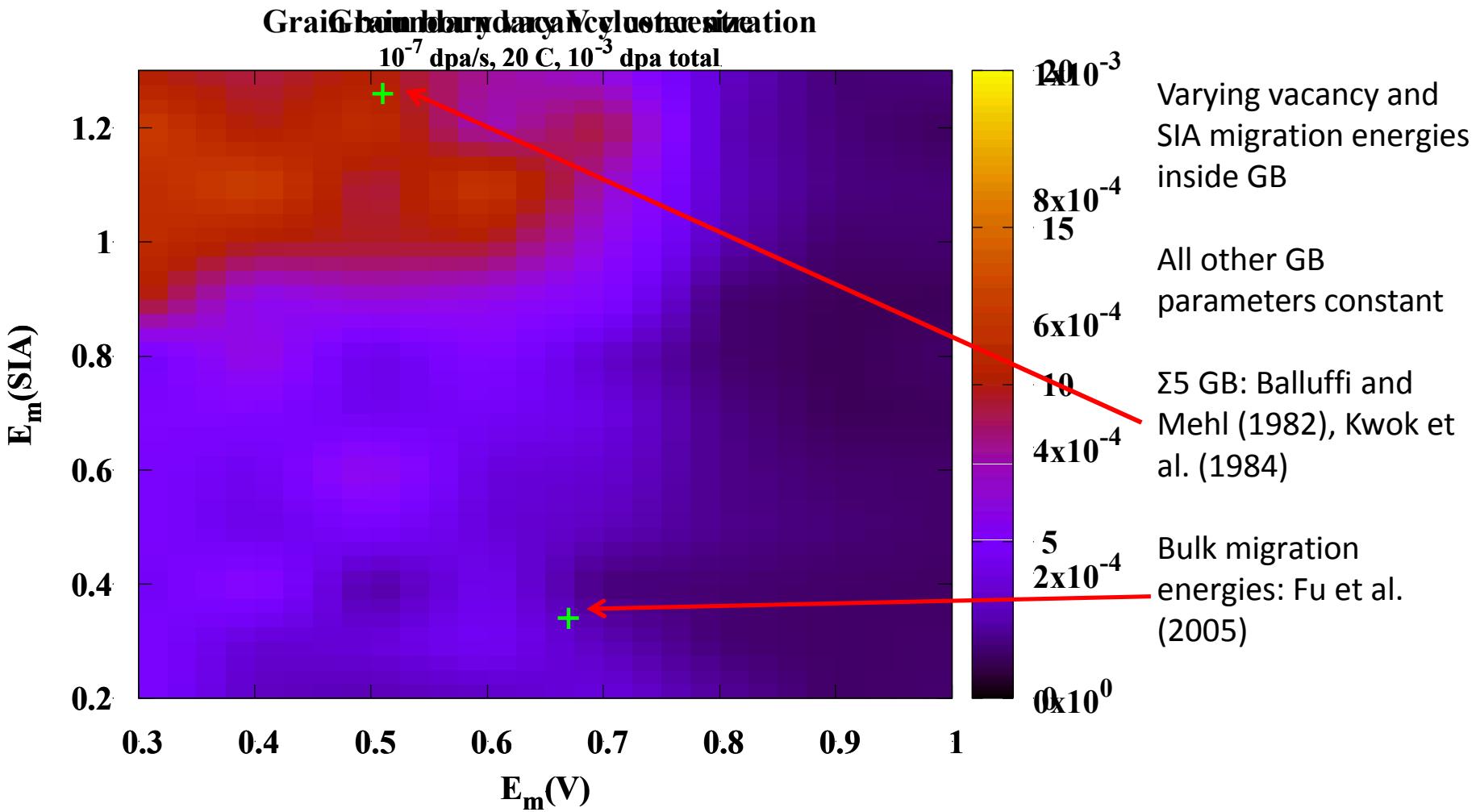
# Multivariate analysis: quantities varied

Quantity	$E_m(V)$	$E_m(SIA)$	$E_m(V$ Clusters)	$E_m(SIA$ Clusters)
Domain (eV)	0.3 – 1.0	0.2 – 1.3	0.2 – 1.0	0.2 – 1.3
Quantity	$E_b(V$ to V Clusters)	$E_b(SIA$ to SIA Clusters)	$E_b(V$ to GB)	$E_b(SIA$ to GB)
Domain (eV)	0.3 – 3.9	0.8 – 4.4	0.0 – 1.2	0.0 – 2.5

- Vary two parameters while holding others constant. Parameters not varied set to default (bulk) energies
- **Quantities measured:**
  1. Grain boundary vacancy concentration
  2. Grain boundary average vacancy cluster size
  3. Grain boundary sink efficiency  $\eta$  (for vacancies and SIAs)
- **Irradiation conditions:**

Uniform room temperature implantation of Frenkel pairs into grain  
Total dose of  $10^{-3}$ - $10^{-2}$  dpa  
Dose rate  $10^{-7}$  dpa s<sup>-1</sup>

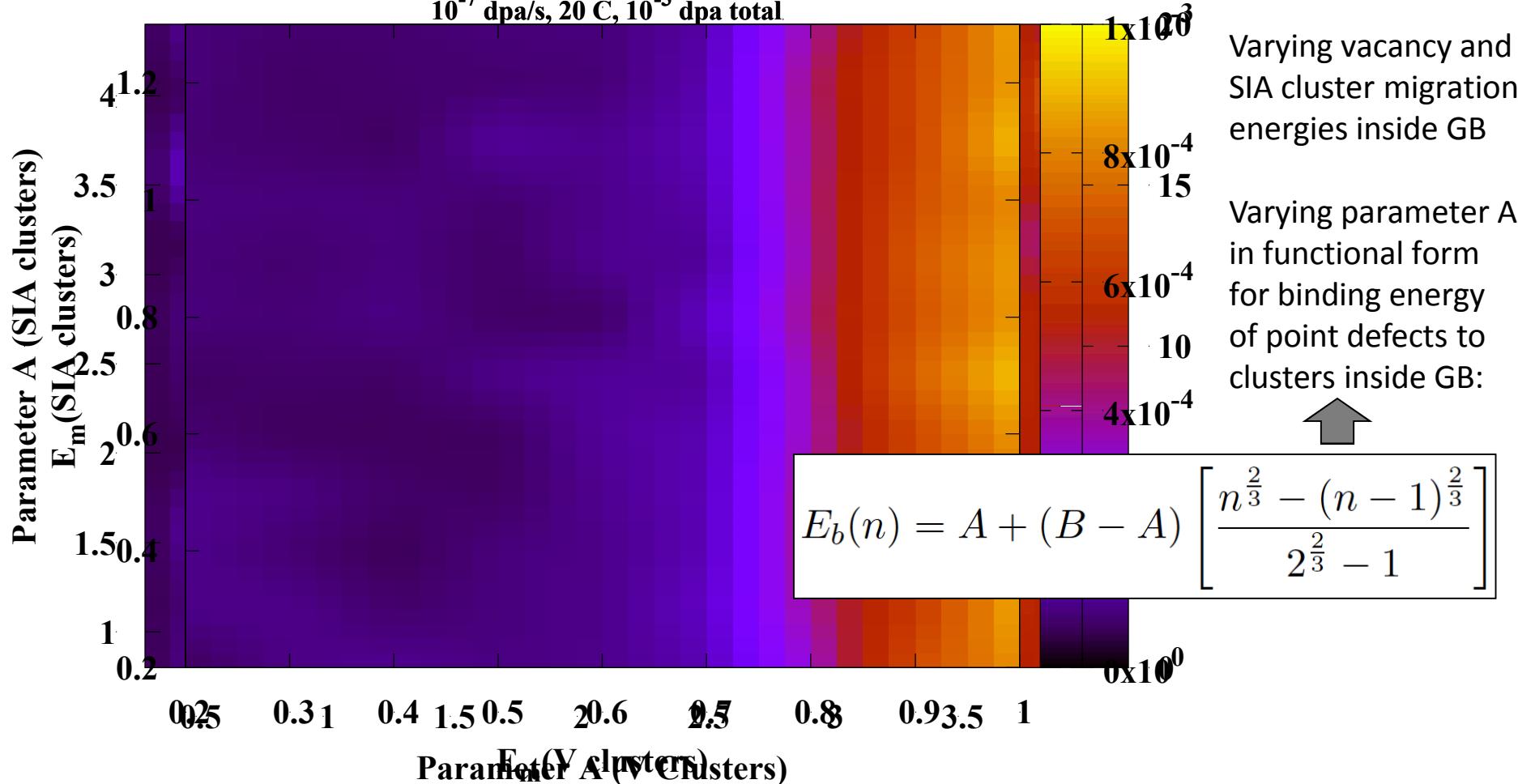
# Results: Point Defect Diffusion



- Both vacancy and SIA migration energies inside GB strongly influence damage accumulation

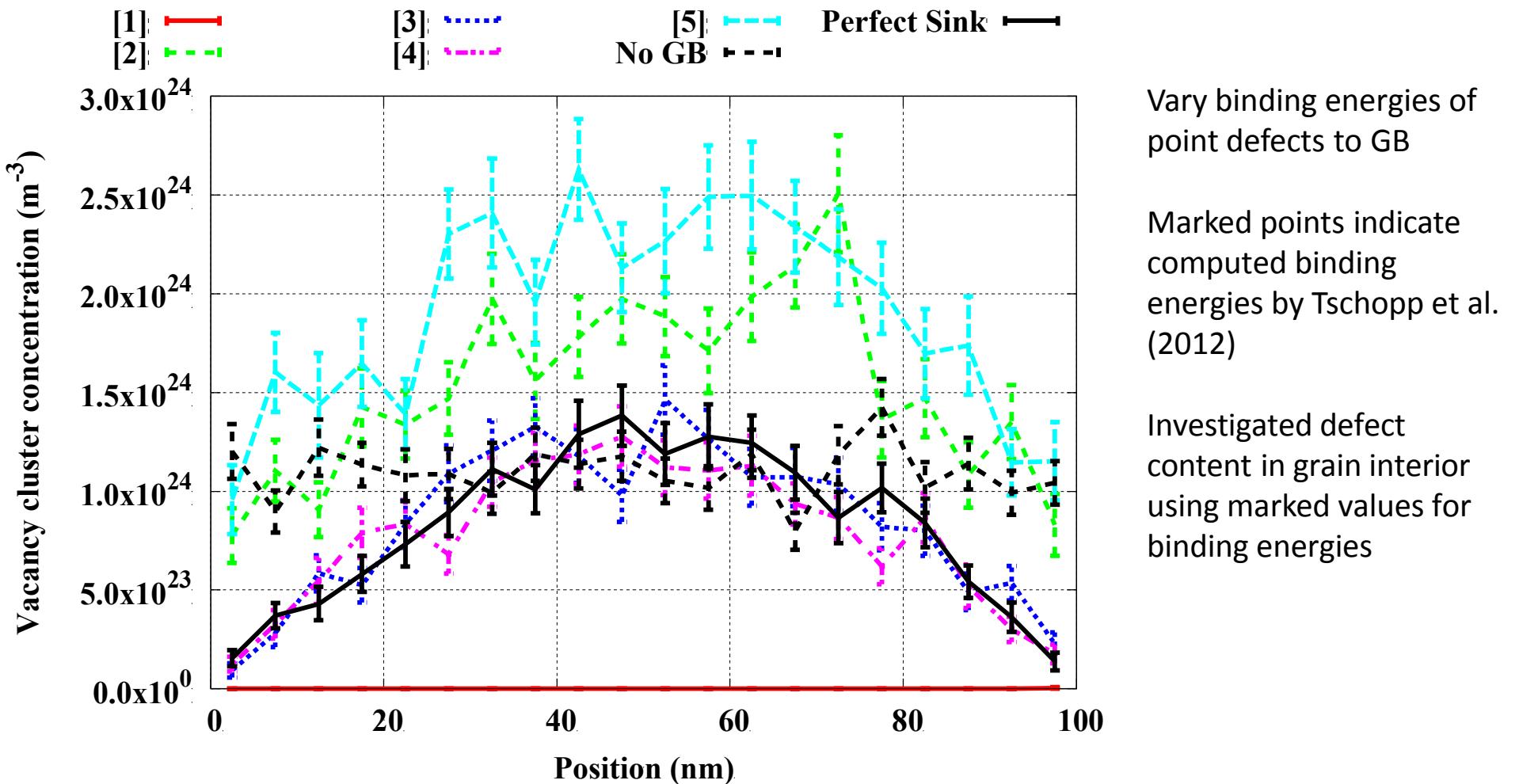
# Results: Cluster Diffusion and Cluster Binding Energy

Grain boundary SIA cluster migration ( $V_m = 0.5$ ) = 0.51 eV (SIA<sub>m</sub>) (SIA<sub>2</sub>) = 0.26 eV  
 $10^{-7}$  dpa/s, 20 C,  $10^{-3}$  dpa total



- Vacancy cluster migration energy strongly influences damage accumulation, SIA cluster migration energy, V and SIA cluster binding energies less significant

# Results: Grain Boundary Binding Energy



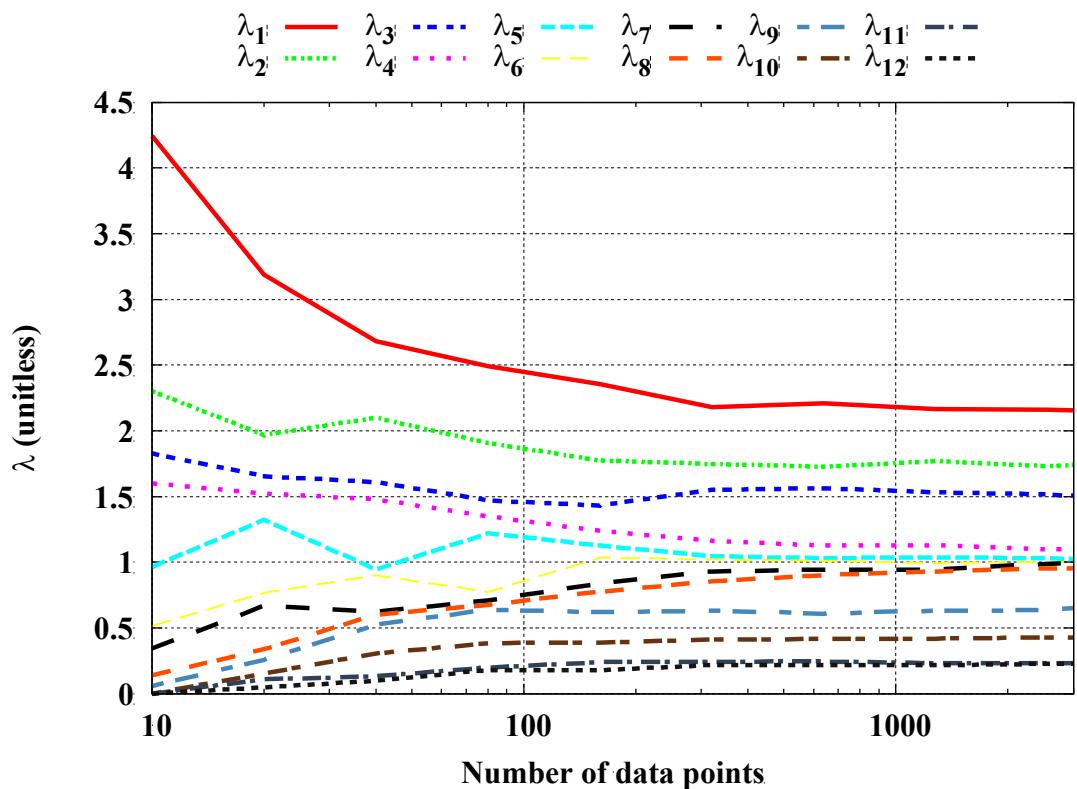
- Different vacancy accumulation behavior depending on the binding energy of point defects to grain boundary
- Damage accumulation ranging from no defects in grain interior [1] to perfect sink behavior [3], [4] to an increase in vacancy content in the grain interior [2], [5]

# Principal Component Analysis

Quantity	$E_m(V)$	$E_m(SIA)$	$E_m(V$ Clusters)	$E_m(SIA$ Clusters)
Domain (eV)	0.3 – 1.0	0.2 – 1.3	0.2 – 1.0	0.2 – 1.3

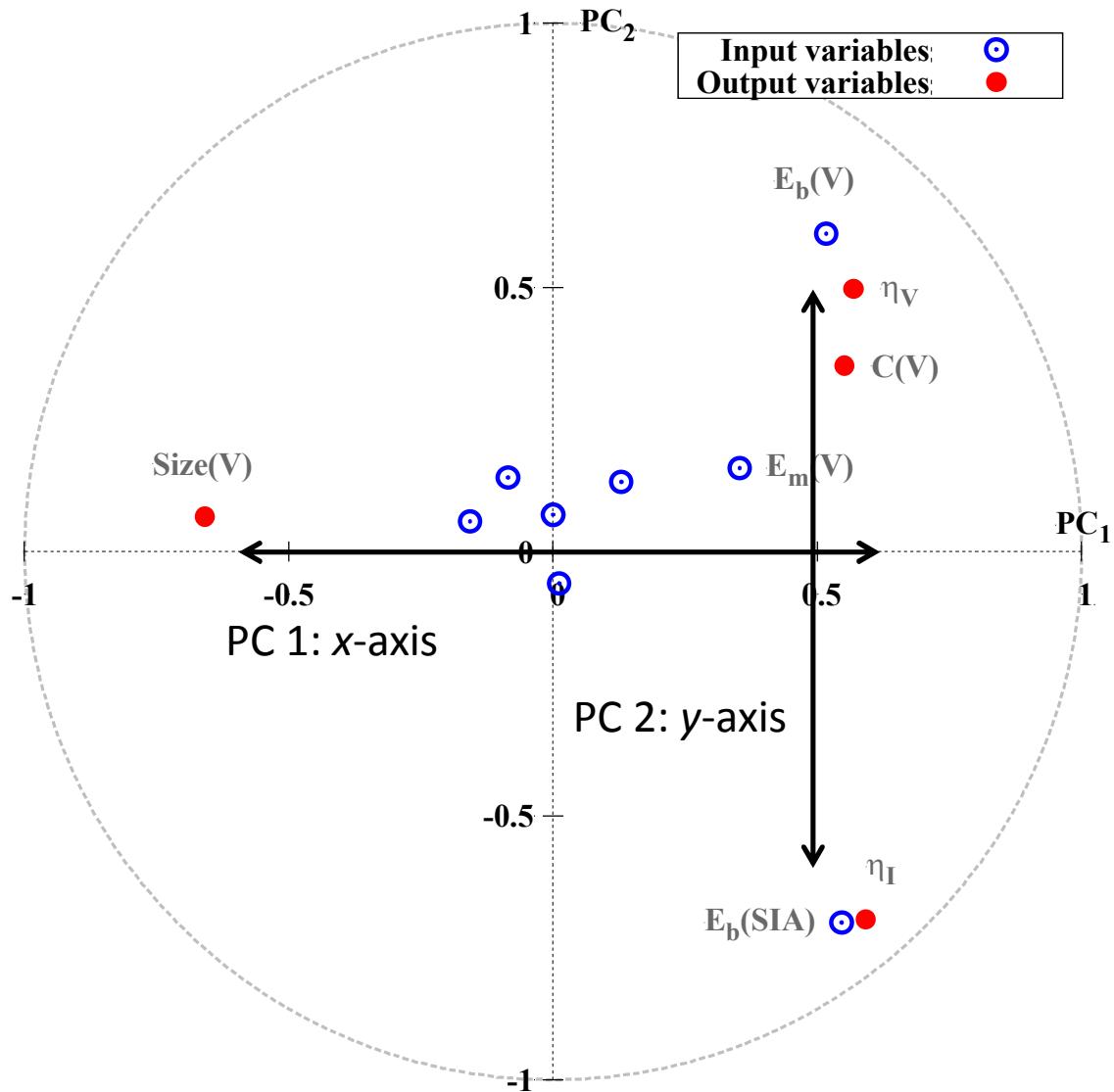
Quantity	$E_b(V$ to V Clusters)	$E_b(SIA$ to SIA Clusters)	$E_b(V$ to GB)	$E_b(SIA$ to GB)
Domain (eV)	0.3 – 3.9	0.8 – 4.4	0.0 – 1.2	0.0 – 2.5

- Random choice of each input parameter during each simulation (see chart above)
- Measure  $C(V)$ ,  $\text{Size}(V)$ ,  $\eta(V)$ ,  $\eta(SIA)$
- **Correlation matrix:** gives correlations between varied parameters and measured quantities
- Eigenvalues of correlation matrix show stability after 3000 simulations



# Principal Component Analysis: Results

- **Principal components:** eigenvectors of correlation matrix
- 77-87% of variation in measured variables explained by four principal components
- **Circle of correlation:** visualization method for principal component analysis
- **Agreement with previous results:** most important variables are single defect diffusion and binding energy to grain boundary



# Conclusions

1. Experimental trends relating grain size to defect content reproduced by treating grain boundary as a perfect sink
2. Developed framework for investigating influence of grain boundary defect behavior on damage accumulation / sink efficiency
3. Variables that most strongly influence damage accumulation: single defect diffusion, vacancy cluster diffusion, and binding of defects to grain boundaries
4. Future work: pair with atomistic studies to predict damage evolution near specific grain boundaries

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