Stochastic effects in mesoscale materials simulations

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Diffusion: fluctuation and dissipation

- Nuclear applications require high operating temperatures
- Irradiation drives systems away from equilibrium
- Stochastic effects govern microstructural evolution
- Dislocation motion, atomic migration is *overdamped*
- Diffusion-type behaviour
 - Mathematically, this means one time derivative, not two
- Can't have dissipation without fluctuations (Einstein)



Stochastic effects, elastic forces



Movie courtesy Prof K Arakawa, Shimane University, irradiated Fe at 400C



Stochastic effects, elastic forces



500°C 800°C 950°C 1100°C 1400°C

W irradiated to 1.5dpa, 500°C, 2MeV W+. 1 hour anneals F Ferroni, P Edmondson, SPF et al Acta Mat 2014



Clustering in irradiated W-Re-Os



"Solute" migration mediated by vacancies and interstitials, hence enhanced by irradiation

Strongly dependent on temperature, dose

CSC Seminar, Warwick, November 2016 Xu et al, Acta Mat 2015



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Modelling paradigms

Atomic coordinates

- DFT* hundreds of atoms, no free parameters, ps, 0K
- MD millions of atoms, potential dependent, ns, finite temp.
- kMC large length and time scales, dependent on rates (need all *a priori*)

Collective coordinates (far fewer)

- DDD microns, milliseconds, need local rules to deal with interactions
- Langevin dynamics large length and timescales, need phenomenological models, *no rates or rare event assumptions*

Mean field (densities and concentrations)

 Phase field – specify system by a few phase/conc. variables, evolve according to Cahn-Hilliard/Allen-Cahn equations

CSC Seminar, Warwick, November 2016 *DFT uses a density field for the electrons



This talk

Collective coordinates

» defects, not atoms

- Crowdions in transition metals and alloys
 » upscaling the mechanics of defects
- Langevin dynamics and diffusion

» a new paradigm for stochastic simulations

Discrete dislocation dynamics

» adding fluctuations to the dissipation
» damage in thin films and microcantilevers
» nonlinear velocity reponse





S. L. Dudarev, Phil. Mag. 2008

crowdion shown in red not just one atom!



<111> crowdions in bcc metals



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crowdion shown in red not just one atom!



<111> crowdions in bcc metals



S. L. Dudarev, Phil. Mag. 2008

Integrate out atoms

Treat defect as fundamental object – point in this case



Dislocations



Integrate out atoms Treat defect as fundamental object – line in this case



Defect equations of motion



- Newton's second law
- Need a *phenomenological model* to assign effective mass and coupling to effective potential
- Deterministic
- No dissipation



Defect equations of motion



- Add friction and noise, neglect inertia
- (assume particle reaches terminal velocity very fast)
- Sidesteps effective mass issue



 $\gamma D = k_{\rm B} T$ FDT $D = \frac{k_{\rm B} T}{\gamma}$

Fluctuation – dissipation theorem

$$\langle v(t)v(t')\rangle = 2D\delta(t-t')$$

Thermal velocity autocorrelation function – assume uncorrelated "white noise". This is the "D" in diffusion/Fokker-Planck equation:

$$\dot{\rho} = \left(\gamma^{-1} \left(-\nabla V \rho\right) + D \rho_{x}\right)_{x}$$

- Relates damping, fluctuations and temperature
- At low temperature and high damping, fluctuations are small
- Not so at high T...



Langevin dynamics

Directly integrate stochastic equation of motion for x(t)

$$\gamma \dot{x} = -\nabla V(x) + \eta(t)$$

- Includes random force drawn from suitable distribution each timestep
- cf Ginzburg-Landau approach
 - Also cf Allen-Cahn

$$\Gamma \frac{\partial q}{\partial t} = -\frac{\delta E}{\delta q} + \xi$$

- Dynamics is a gradient flow (plus noise), no inertia
- Quasi-off lattice method

See eg Swinburne et al PRB 2013, Dudarev et al PRB 2010



Frenkel-Kontorova model for crowdions

- Few parameters (lattice spacing *a*, spring constant *β*, height of sine potential V₀ mass of atoms *m*)
- Lagrangian for displacement of nth atom $u_n(t)$: Originally used to model dislocation core • Now $\mathcal{L} = \sum_{n=1}^{\infty} \left(\frac{m \dot{u}_n^2}{d^2 t_0} - \frac{\beta}{d^2} (u_{n+1} - u_n)^2 - V_0 \sin^2 \frac{\pi u}{\rho \sigma} \right)$ • Equation of motion (in continuum limit β term becomes a derivative, $u_n(t) \longrightarrow u(z, t)$): Basic idea: ID chain of atoms connected by mli(zr,nt)o-n $\beta a^{2}p(znz)''$, pre V_{0} sidi $(2\pi u(ztt)/a)$ equation potential $\mu^2 = \frac{2V_0\pi^2}{\beta a^4}$ • Kink solution: $u = \frac{2}{\pi} \arctan\left(\exp\left[-\mu(z - Vt - z_0)\right]\right)$



DFT calculation of V_0 for tungsten



- Not sinusoidal
- Clear local minimum
- Sine approximation can be viewed as first term in Fourier series of true potential
- Can we do better?



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DFT calculation of V_0 for tungsten



- Yes!
- 2 parameter fit very accurate
- Captures local minimum
- Can still get an analytical form for the displacement field:

$$V_0 = \mu^2 \left(\sin^2 \frac{\pi z}{a} + \lambda \sin^2 \frac{2\pi z}{a} \right) \quad u = \frac{a}{\pi} \tan^{-1} \left(\frac{\alpha}{\sinh(\mu a(z - z_0))} \right)$$

CSC Seminar, Warwick, November 2016 Solution first found by Frank and van der Merwe for dislocations





Clear group-specific trend – "double-hump" most pronounced in Group VI metals

SPF and Nguyen Manh PRL 2008



Migration barriers

- Lattice potential ~ few eV
- What about defect migration potential? Much lower
- Soliton solution *locally* partitions energy equally between string and substrate
- So can write energy in discrete form as:

$$E = \int_{-\infty}^{\infty} \left[\frac{\beta}{2} \left(\frac{\partial u}{\partial z} \right)^2 + V(u) \right] dz \longrightarrow 2 \sum_{n=-\infty}^{\infty} V(u_n)$$

$$u_n = u(z_n) = u(na - z_0)^{4}$$

Crowdion centre of mass collective coordinate

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Energy no longer indpt of z_0 UNIVERSITY OF LEEDS

Migration potential – Peierls potential

Can calculate Fourier series for defect migration potential

$$E_{0} \text{ is ctm energy} \qquad E(z_{0}) = E_{0} + \sum_{j=1}^{\infty} I_{j} \cos\left(\frac{2\pi j z_{0}}{a}\right)$$
$$I_{j} = \frac{2V_{0}\alpha\pi}{\mu a} \operatorname{cosech}\left(\frac{\xi\pi}{2}\right)$$
$$\times \left\{\xi\cos\left(\frac{\xi}{4}\ln\frac{q_{+}}{q_{-}}\right) - \frac{1}{\alpha\sqrt{\alpha^{2}-1}}\sin\left(\frac{\xi}{4}\ln\frac{q_{+}}{q_{-}}\right)\right\}$$

$$\xi=2\pi j/lpha\mu$$
a, $q_{\pm}=1-2lpha^2\pm 2lpha\sqrt{lpha^2-1}$

• Note considerable simplification for single-sine case ($\alpha = 1$)





Migration temperatures



Ehrhart et al in Landolt-Bornstein 1991 (resistivity recovery)

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SPF and Nguyen-Manh, PRL 2008



Diffusion coefficients

Generally (eg. for kMC rates) Arrhenius-type law is used

$$D = D_0 e^{-E_{\text{barrier}}/k_{\text{B}}T}$$

- Assumes E > kT "rare event escapes"
- For crowdions at all but the very lowest temperatures this isn't true
- *Lifson-Jackson* formula for diffusion in a periodic potential:

$$D \propto \frac{k_{\rm B}T}{\left(\oint {\rm e}^{-V/k_{\rm B}T}{\rm d}x\right)\left(\oint {\rm e}^{+V/k_{\rm B}T}{\rm d}x\right)}$$

- Reduces to Arrhenius when E >> kT
- See Swinburne at el, PRB 2013, Risken, "The Fokker-Planck Equation"





Metal	Group	Т _м (К)	E _B /k _B
V	5B	<6	~8
Nb	5B	<6	~0
Та	5B	<6	~0
Cr	6B	~40	~100
Мо	6B	35	~30
W	6B	27	~30

Ehrhart et al in Landolt-Bornstein 1991 (resistivity recovery)

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Swinburne at el, PRB 2013



Crowdion pair potential (W)

~12 atoms



Noves PF, NIMB, 2014

- Slight barrier to overcome, but once in the well it will
 Position (a) stay there
 - "Ostwald ripening" for loops is difficult
 - small loops may be absorbed by larger ones, but they won't shrink much by emitting interstitials

$$Y(x) = \frac{2V_0}{3\mu} \tanh\left(\frac{\mu x}{2}\right) \left(\frac{\mu x}{2} \operatorname{sech}^2\left(\frac{\mu x}{2}\right) + \tanh\left(\frac{\mu x}{2}\right)\right) - \frac{2V_0}{3\mu}$$

*assumes const µ

** Marinica et al JPCM 2013



Solutes

- Can generalize Frenkel-Kontorova model by changing one of the atoms in the string
 - change its mass, spring constant, coupling to the periodic potential
- Can derive an analytic potential
- For coupling/spring constant impurity, ie. similar mass (Re,Ta in W for example)

$$V(x) = \Delta V_0 \operatorname{sech}^2 \mu x$$

- ΔV_0 is the difference in the coupling/spring constant (they add)
- Mass impurity is (much) more complicated future work

Braun and Kivshar, PRB 1991

Crowdion dynamics in the FK model

- Few parameters:
 - lattice spacing a
 - spring constant β
 - height of sine potential V_0
 - mass of atoms m
 - solute potential ΔV_0

 $=\frac{2V_0\pi^2}{6\sigma^4}$

 $V(x) = \Delta V_0 \operatorname{sech}^2 \mu x$





collective coordinates



Fits to (one-parameter, μ fixed) $V(x) = \Delta V_0 \operatorname{sech}^2 \mu x$ analytic potential

NB can be attractive or repulsive, inhibits clustering either way



Ta very good, Re less so

Likely to relate to the double hump lattice potential in W



SPF and Nguyen Manh PRL 2008



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Points from DFT, Muzyk et al PRB 2011

Toy simulations, "Ta in W at 1000K"



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SPF, NIMB, 2014



Toy simulations, "Ta in W at 1000K"



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SPF, NIMB, 2014



DDD simulations

- PK force calculated on dislocation segments
- Resolved into glide and climb components
- Nodes moved according to mobility function, $V_{\rm node} \propto F_{\rm node}$



See eg Bulatov & Cai textbook, OUP 2006



Stochastic effects, elastic forces



500°C 800°C 950°C 1100°C 1400°C

W irradiated to 1.5dpa, 500°C, 2Mev W+. 1 hour anneals F Ferroni, P Edmondson, SPF et al submitted 2014



Loop coalescence at 1000°C





(h) t=0 (i) t=10 (j) t=34 (k) t=35 (l) t=36 (m) t=42

- Damage loops coarsen and coalesce
- "Finger loops" form, lead to network dislocations
- loops escape to foil surface
- Stochastic effects anneal out damage, need stochastic dynamics to quantify

CSC Seminar, Warwick, November 2016 *F Ferroni, SPF et al submitted 2014; see also work of Jenkins, Yao, Kirk et al*





- Motion confined to glide plane
- Relatively easy, bonds break and re-form
- Above very low temperatures and applied stresses, weakly dependent on temperature

Hirth and Lothe





- Motion out of the glide plane (edge cpts only)
- Requires diffusion of point defects to and around dislocation core
- Strongly temperature dependent (via vacancy concentration and diffusivity)



Fluctuations and dissipation for extended objects

- Dislocation drag/friction/dissipation well established
- Overdamped dynamics observed in TEM (see eg Caillard Acta 2010)
- Edge drag << screw drag << climb* drag
- Strong temperature dependence, esp climb
- What about fluctuations at high temperatures?
- What does the FDT look like?

*this is "mean field", no resolution of individual vacancies



Stochastic DDD simulations





(h) t=0 (i) t=10 (j) t=34 sec sec (k) t=35 (l) t=36 (m) t=42 sec sec sec sec

F Ferroni, SPF



Stochastic DDD simulations



F Ferroni, SPF

• Fast glide to form loop chains

- Slower climb & fluctuations form finger loop
- Finger loop then diffuses along glide prism
- NB stochastic motion of loops also treated by Dudarev, Derlet et al JNM 2014
- Treated loops as interacting particles – collective coordinates again
- Captured chain formation but not coalescence



DDD simulations of experiments



F Ferroni, SPF et al



— 9 µm —

D Armstrong, S Roberts et al

- TEM foils are thin
 - loop loss to surface due to image forces
- Microcantilever mech. prop. experiments
 - size effect, disl. starvation etc
 - large body of work on this
- Need to treat free surfaces
 - spectral method for thin films
 - need FEM for 3D geometry





- Thin films: can use spectral method for images (Weinberger, Aubry,... Cai 2009)
- Also need virtual segments to correctly model escape-to-surface



 Use GPU code to accelerate

50x speed-up

Ferroni, Tarleton, SPF, MSMSE 2014, J Comp Phys 2014



GPU acceleration



NVIDIA Titan Black ~£1000



GPU acceleration



Figure 1: Parallelism of the N^2 segment interactions (a), surface traction at k grid points (b) and image stress on N segments (c).

- Thin films, eg TEM foils: can use spectral method for images (Weinberger, Aubry,... Cai 2009); more complex geometries need FEM, see Ed's talk
- Also need virtual segments to correctly model escape-to-surface
 - Use GPU code to accelerate
 - >50x speed-up

Ferroni, Tarleton, SPF, MSMSE 2014, J Comp Phys 2014





GPU acceleration

CUDA speed-up vs # of segments (seg-seg force calcs)

CUDA speed-up vs # of segments (image stress calcs)



Large Simulations

Start of simulation

End of simulation





Large Simulations



F Ferroni, SPF 2015

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3D geometries require FEM coupling *(see also Tang, Marian, Arsenlis; Fivel et al)*



Nonlinear dislocation response

- Dislocation statics well-understood within elasticity theory
- Dynamics far less well understood
- Strongly nonlinear temperature and strain rate dependence

At low T, $v \sim \sigma^{20-40}$, at RT $v \sim \sigma^4$

See eg. Nadgornyi Prog Mater Sci 1988 Christian and Altschuler 1967 Turner and Veeland 1970

- Atomistic modelling restricted to short times and extremely high strain rates
- Discrete dislocation simulations have far greater scope, but require phenomenological input -- sometimes highly speculative, eg:

velocity = $\mathbf{v} = \mathbf{B} \cdot \boldsymbol{\sigma}$ = const. drag matrix \otimes stress



Dislocation velocities

- Dislocation velocities measured by slip band growth technique
- Iron single crystals
- NB: caution, log-log plot!
- Turner and Vreeland, Acta Met. 1970

10 373°ĸ 295°K 1 DISLOCATION VELOCITY (cm/sec) 10-1 10-2 198°K 10-3 77°K 10-4 10-5 10-6 10 10 50 100 500 1000 RESOLVED SHEAR STRESS (Mdyn/cm²)

FIG. 7. Velocity of edge dislocations in iron single crystals as a function of resolved shear stress for several temperatures.

MD simulations of dislocation motion



Gilbert, Queyreau, Marian PRB 2011



Kinks

- Dislocation motion appears overdamped
 - *in situ* straining experiments, dislocations stop immediately the stress is removed
- Dislocations move through "washboard" Peierls potential
- Generally accepted that this is mediated by nucleation and propagation of kinks*
- Tilt is the applied force





CSC Seminar, Warwick, November 2016 *See e.g. Seeger and Schiller, Hirth and Lothe, Joos and Duesbery, many others since



Kinks

- Rate of kink pair nucleation and/or propagation controls dislocation's velocity
 out of equilibrium
- Sounds simple but it isn't.
- Experimental measurement difficult, extremely sensitive to impurities
- Guess: velocity ~ exp [$-(H_{KP} \sigma^*V)/kT$]
 - $H_{\rm KP}$ is the kink pair elastic energy, ~ few eV

Arrhenius behaviour

- σ is the applied stress
- V is "activation volume" ~ few |b|³
- leads to temperature-dependent activation energy fits
- May work for high stresses, low temperatures, but not good for low stresses close to Peierls stress – creep, fracture
- Quantum effects can be important at low temperatures.

CSC Seminar, Warwick, November 2016 See for example Petukhov and Pokrovskii Soviet JETP 1973; Tarleton et al, Acta Mat 2008; Proville, Rodney, Marinica Nature Mat 2012





Fluctuation – dissipation theorem $\mathcal{P}[\eta] \sim \mathrm{e}^{-rac{1}{4D}\int \eta^2 \mathrm{d}t}$

Probability distribution for Gaussian white noise (other types of noise are available!). This is the "D" in diffusion/ Fokker-Planck equation:

- Relates damping, fluctuations and temperature
- At low temperature and high damping, fluctuations are small
- Not so at high T...



Stochastic equation of motion

 Start from the Frenkel-Kontorova model/sine-Gordon equation:

$$\mathcal{L} = \frac{1}{2}\phi_t^2 - \frac{1}{2}\beta\phi_x^2 - V_0\sin^2\pi\phi$$

$$\rho\phi_{tt} - \beta\phi_{xx} = -V_0\pi\sin 2\pi\phi$$

Leads to kink solutions:

$$\phi(x,t) = \frac{2}{\pi} \tan^{-1} \exp \mu(x - Vt)$$

• μ is the inverse kink width ~ (LH / RH kinks) $\pm \sqrt{2V_0\pi^2/\beta}$



$$\Gamma\phi_t = \beta\phi_{xx} - V_0\pi\sin 2\pi\phi - F + \xi(x,t) = -\frac{\delta\mathcal{H}}{\delta\phi} + \xi(x,t)$$

- Add friction, driving force, random force, neglect inertia (overdamped limit) gives *Langevin equation*
- *H* is the string Hamiltonian or *energy*:

$$\mathcal{H}[\phi] = \int_{-\infty}^{\infty} \left(\frac{1}{2}\beta\phi_x^2 + V(\phi)\right) dx$$

Integral of elastic (first term) plus potential (second term)

$$V(\phi) = V_0 \sin^2 \pi \phi - F \phi$$



• Simplest option for the noise is uncorrelated Gaussian white noise, with correlation function

$$\langle \xi(x,t)\xi(x',t')\rangle = 2D\delta(x-x')\delta(t-t')$$

• and distribution $\mathcal{P}[\xi] \propto \exp{-\frac{1}{4D}} \int \int \xi(x,t)^2 dx dt$

- *D* is the noise strength and $D = \Gamma k_B T$ by the fluctuationdissipation theorem
- Rearrange Langevin equation to

$$\Gamma\phi_t + \frac{\delta\mathcal{H}}{\delta\phi} = \xi(x, t)$$

• Substitute for ξ leads to ...



$$\mathcal{P}[\phi] \propto \exp{-\frac{1}{4D}} \int \int \left(\Gamma\phi_t + \frac{\delta\mathcal{H}}{\delta\phi}\right)^2 dxdt$$
$$\equiv \exp{-\frac{1}{4D}} \mathcal{S}[\phi] \longleftarrow \text{Onsager-Machlup action S}$$

- Distribution for $\varphi(x,t)$! (I have glossed over some details here)
- Rate of transition from metastable well to stable one given by:

$$\sum_{\text{aths }\phi_i} e^{-\mathcal{S}[\phi_i]/4D} = \int \mathcal{D}\phi \, e^{-\int (\Gamma \phi_t - \beta \phi_{xx} + V'(\phi))^2/4D}$$

- where the sum/integral is taken over all configurations φ that satisfy the initial and final conditions



р

$$\int \mathcal{D}\phi \,\mathrm{e}^{-\int (\Gamma\phi_t - \beta\phi_{xx} + V'(\phi))^2/4D}$$

- This object is possibly infinite, and is awkward to define rigorously
- It is the stat. mech. analogue of the Feynman path integral for the quantum mech. matrix element

• The integrand
$$\left(\Gamma\phi_t + \frac{\delta\mathcal{H}}{\delta\phi}\right)^2$$
 is the analogue of the Lagrangian

• In the weak noise limit, the integral will be dominated by φ s which satisfy the Euler-Lagrange equations

$$\left(\Gamma \partial_t + \beta \partial_x^2 - V''(\phi)\right) \left(\Gamma \phi_t - \beta \phi_{xx} + V'(\phi)\right) = 0$$

$$V(\phi) = V_0 \sin^2 \pi \phi - F \phi$$



$$\left(\Gamma \partial_t + \beta \partial_x^2 - V''(\phi)\right) \left(\Gamma \phi_t - \beta \phi_{xx} + V'(\phi)\right) = 0$$

- Two solutions: ϕ^- satisfying $\Gamma \phi^-_t \beta \phi^-_{xx} + V'(\phi^-) = 0$
- (noiseless equation of motion)
- ϕ^+ satisfying $\Gamma \phi^+_t + eta \phi^+_{\scriptscriptstyle XX} V'(\phi^+) = 0$
- Like the noiseless equation of motion, but with the potential flipped
- Motion against the barrier controls the escape rate, and hence the kink pair nucleation rate.
- cf instantons in quantum field theory (G t'Hooft, S Coleman, ...)

Bray et al, PRB 1990



- KP nucleation rate given by
- But what is ϕ^+ ? Do we need to solve that horrible equation to find it?
- Luckily no:

$$\begin{split} \mathcal{S}^{+} &= \int \mathrm{d}t \int \mathrm{d}x \left(2\Gamma \phi_{t}^{+} \right)^{2} \\ &= 4\Gamma \int \mathrm{d}x \int_{\min}^{\mathrm{saddle}} \mathrm{d}\phi^{+} \, \frac{\delta \mathcal{H}}{\delta \phi^{+}} \\ &= 4\Gamma \left(\mathcal{H}[\phi_{\mathrm{saddle}}^{+}] - \mathcal{H}[\phi_{\mathrm{min}}^{+}] \right). \end{split}$$

- S⁺ is the saddle point action, max energy configuration
- cf particle escaping from a well

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Bray et al 1990





At low F, it will be a well-separated kink pair, at high F it will be a small bump



• For the saddle, need to find φ that maximizes

$$\mathcal{H}[\phi] = \int_{-\infty}^{\infty} \left(\frac{1}{2}\beta\phi_x^2 + V(\phi)\right) dx$$

• Use Euler-Lagrange equations for $H[\phi]$

$$\beta \phi_{xx} = +V'(\phi); \quad \frac{1}{2}\beta \phi_x^2 = V(\phi); \quad \beta \phi_x = \pm \sqrt{2\beta V(\phi)}.$$

which lets us write

$$\mathcal{H}^* = \int_{-\infty}^{\infty} \left(\frac{1}{2} \beta \phi_x^2 + V(\phi) \right) dx = \int_{-\infty}^{\infty} \beta \phi_x \frac{d\phi}{dx} dx$$
$$= 2 \int_{\phi_0}^{\phi_1} \sqrt{2\beta V(\phi)} d\phi.$$



• and finally velocity ~

$$\exp -\frac{\mathcal{S}[\phi^+]}{4D} = \exp -\frac{\mathcal{H}^*}{k_BT} = \exp -\frac{2}{k_BT} \int_{\phi_0}^{\phi_1} \sqrt{2\beta V(\phi)} d\phi$$

- Integrals taken between two zeros of *V*; area under red curves
- Exact as far as potential concerned, works for $0 < F < \sigma_P$





SPF, Scientific Reports 2016



- A simple formula velocity = fct. (stress) would be nice for eg implementation in DDD simulations.
- At small stresses, saddle configuration should be a wellseparated kink pair:

$$\phi = \frac{2}{\pi} \tan^{-1} e^{-\mu(x-R/2)} + \frac{2}{\pi} \tan^{-1} e^{\mu(x+R/2)} - 1$$

• Insert this in *H*, maximize over *R*, gives

has no power series at small F.

$$\mathcal{H}_{\mathsf{KP}}^{*} = \sqrt{\frac{\beta V_{0}}{2\pi^{2}}} \left(8 - \mathcal{F} - \mathcal{F} \ln \left(\frac{16}{\mathcal{F}} \right) \right) \qquad \qquad \mathcal{F} = F/V_{0}$$

• This is where the wild nonlinearity comes from:

 $\exp{-\frac{\mathcal{H}^*}{k_BT}}$

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- Left: exact formula (red) and KP approximation (black dashed) fitted to H* extracted from data for edge dislocation velocities in Fe (Turner and Vreeland 1970)
- Right: DFT-based calculation for some bcc metals of H* (Dezerald et al 2015)

1.25 $(1 - (F/V_0)^{0.5})$ cecs mashed line:

November 2016



Right: fit of

$$A \exp{-\frac{\mathcal{H}^*}{k_B T}}$$

to MD velocities (Gilbert et al 2011)

- Screw dislocations in Fe
- Power law isn't appropriate – looks more like a threshold



Conclusions and acknowledgments

- Mesoscale modelling is crucial to bridge the gap in understanding between micro and macro
- Capabilities increasing all the time
- Plenty of room in the middle!
- Thanks to Francesco Ferroni, Ed Tarleton, Daniel Thompson, Dave Armstrong, Steve Roberts and the MFFP group at Oxford; Sergei Dudarev, Duc Nguyen Manh, Tom Swinburne at CCFE







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