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# Development of SNAP potential for ZrC strengthened W

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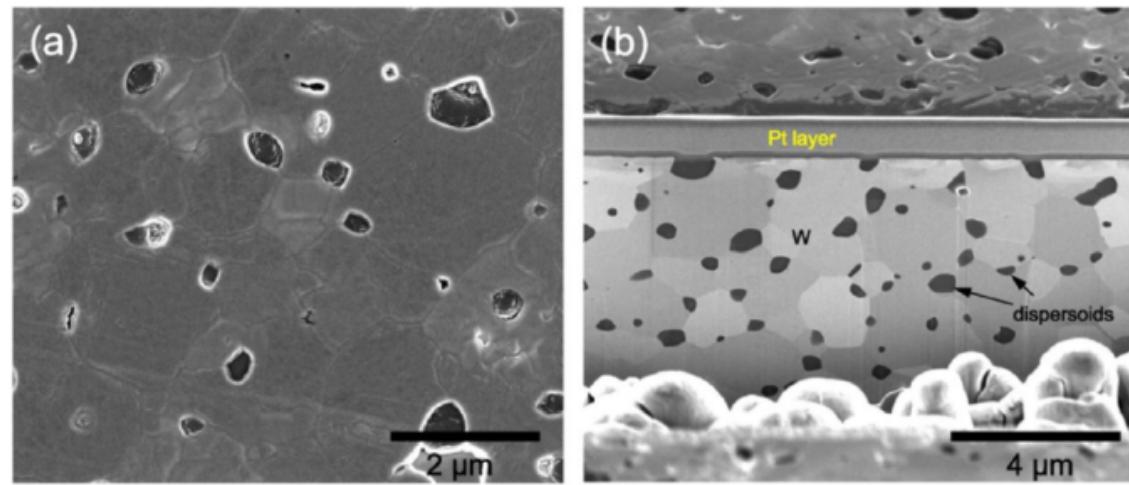


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# How can we investigate the mechanical properties of ZrC dispersoid-strengthened W?



- Plasma facing materials in ITER will experience high temperatures which may lead to W recrystallization and grain growth.<sup>1,2</sup>
- ZrC dispersoids have been shown to improve ductility and limit grain growth.<sup>1,3</sup>
- Effects on microstructure and mechanical properties are not fully understood and atomistic modeling can play a role in understanding these materials.



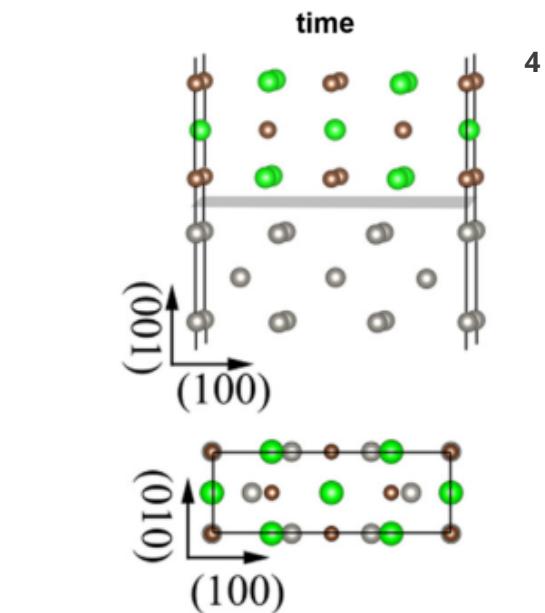
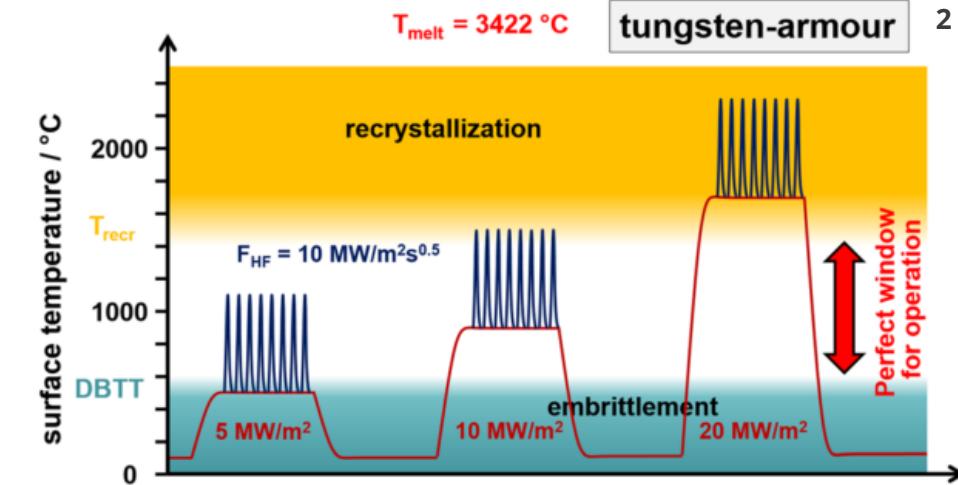
SEM of dispersoid strengthened W

<sup>1</sup>E. Lang et al. / JNM 545 (2021) 152613

<sup>2</sup>J. Linke et al. / Matter Radiat. Extremes 4 (2021) 056201

<sup>3</sup>Z. Xie et al. / Sci. Rep. 5 (2015) 16014

<sup>4</sup>X. Zhang et al. / Appl. Surf. Science 499 (2020) 143995



Density Functional Theory (DFT) ~100 atoms

# The Spectral Neighbor Analysis Potential (SNAP) can map quantum data to a classical interatomic potential.



## Model Form

- Each neighbor position,  $(r, \theta, \phi)$ , is mapped to a point,  $(\theta_0, \phi, \theta)$ , on the unit 3-sphere.
- The basis can be described with bispectrum components,  $B_k^i$ .
- Fitting the linear coefficients,  $\beta_k$ , produces the SNAP potential:

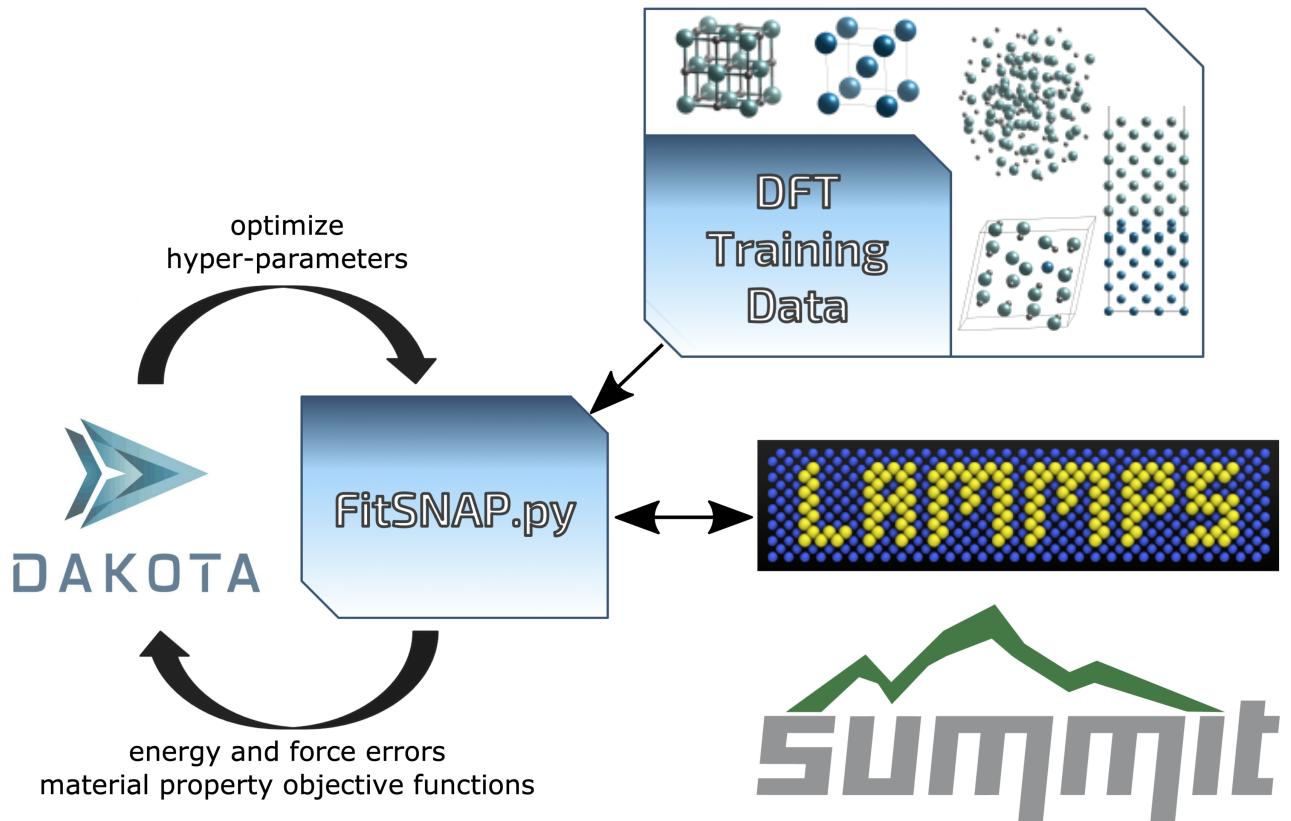
$$E_{SNAP}^i = \beta_0 + \sum_{k=1}^K \beta_k (B_k^i - B_k^i 0)$$

## Linear Regression

$$\min(||\epsilon \cdot (D\beta - T)||^2)$$

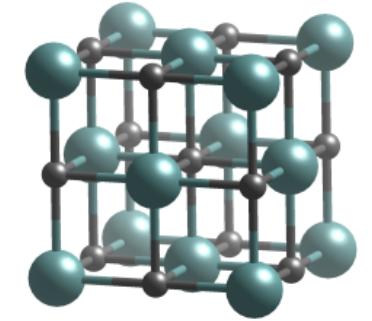
group weight   descriptor prediction   DFT training

## Work flow

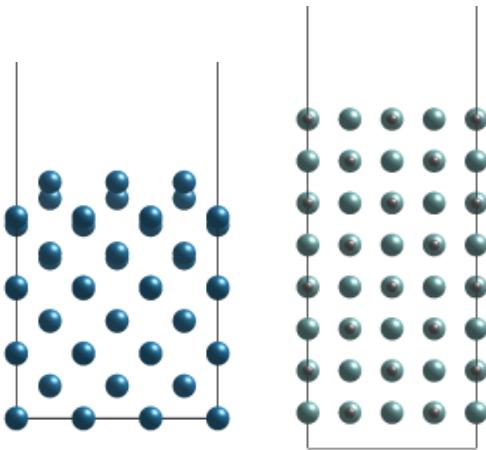
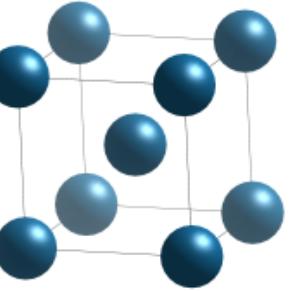


Code available: <https://github.com/FitSNAP/FitSNAP>

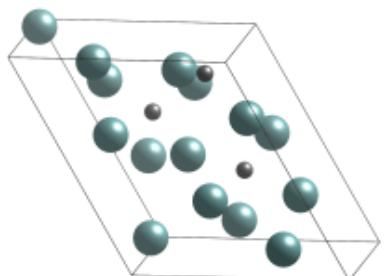
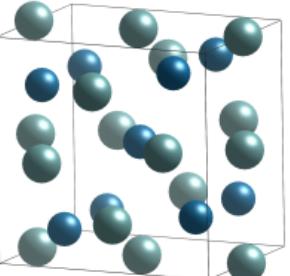
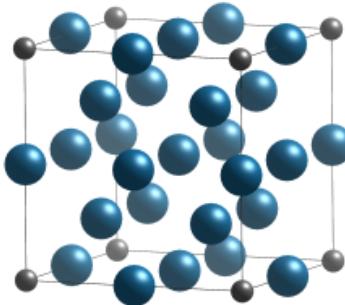
The SNAP W-ZrC potential is trained on a variety of first-principles data (~8,000 structures).



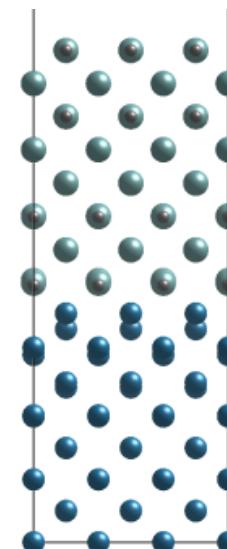
Bulk



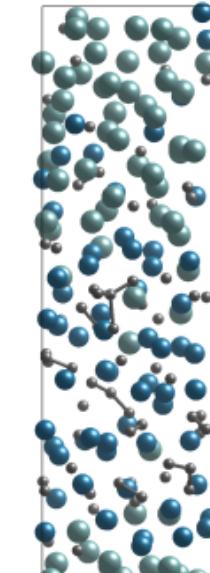
Surfaces



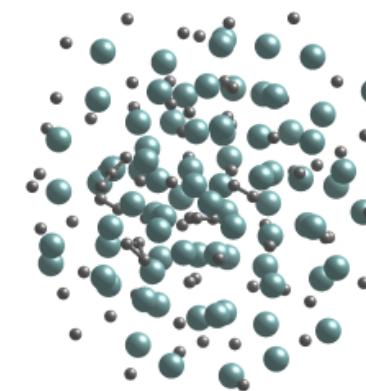
USPEX<sup>1</sup>



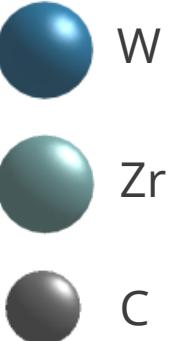
Interfaces



Liquids



“active learning”

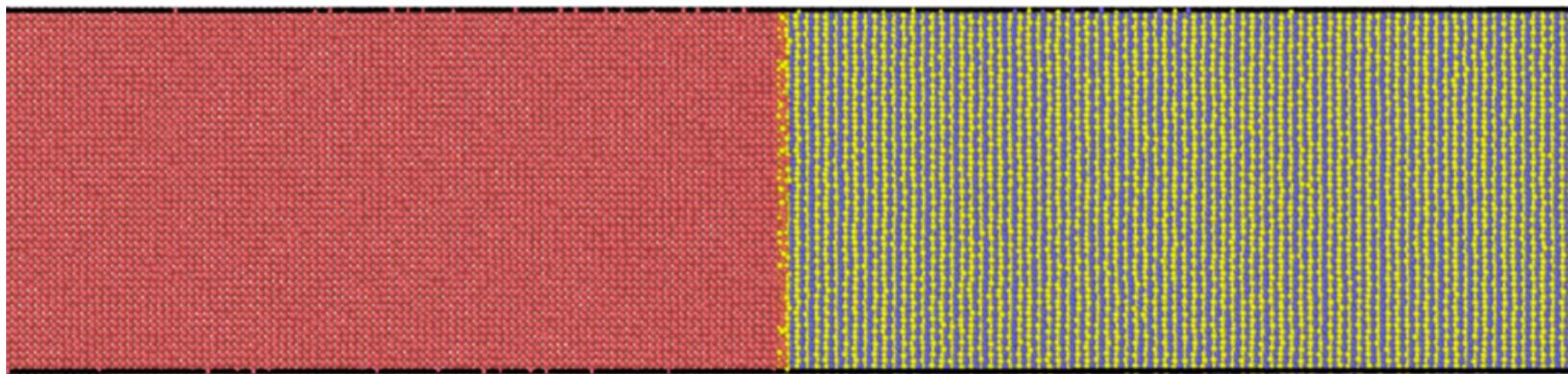


# The W-ZrC SNAP potential agrees with DFT and runs Molecular Dynamics (MD) simulations at 2000K.

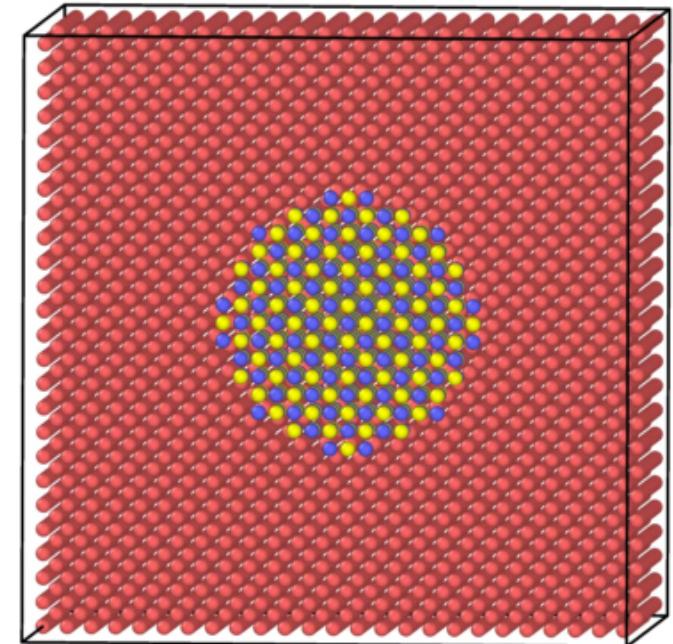


- Performance of the latest potential on bulk modulus,  $B$  (GPa), and surface energies,  $E_{surf}$  (eV/Å<sup>2</sup>):

	$B_W$	$B_{ZrC}$	$E_{surf} W$ (100)	$E_{surf} W$ (110)	$E_{surf} ZrC$ (100)	$E_{surf} ZrC$ (110)
DFT	301.4	216.0	4.13	3.18	1.63	3.31
SNAP	300.9	221.9	3.68	3.38	1.77	3.15



Bicrystal simulation at 2000K  
(~400,000 atoms)



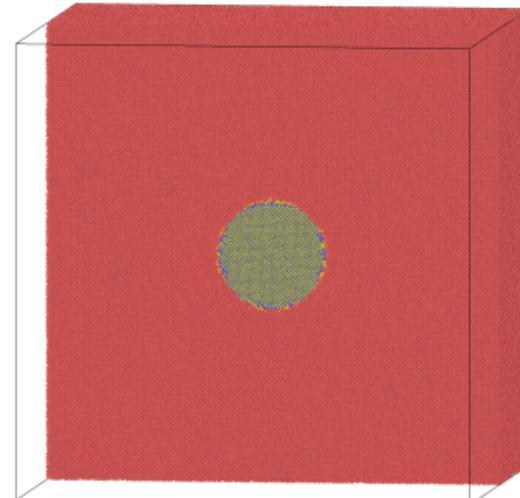
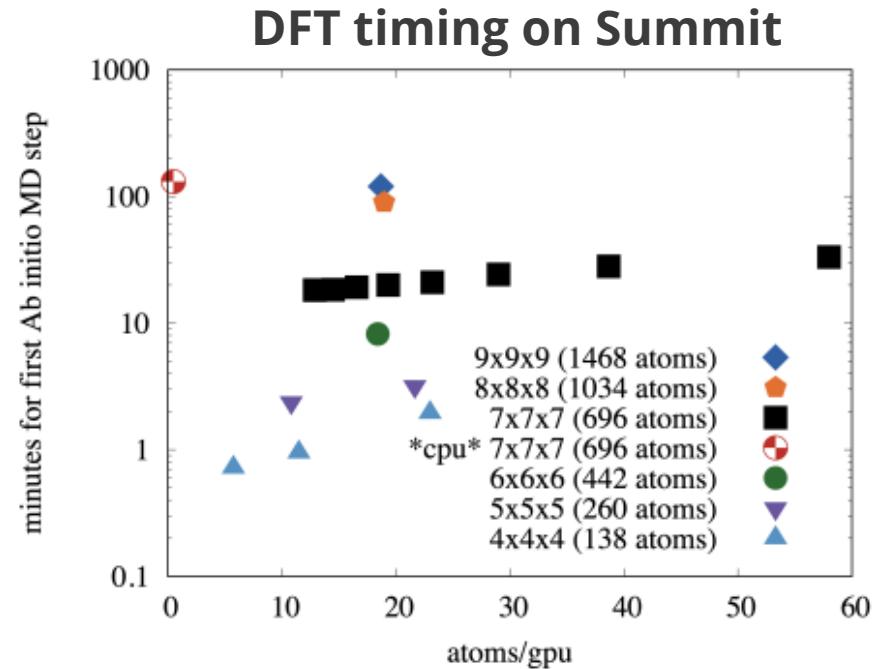
Embedded ZrC sphere -  
minimize followed by 2000K  
(~31,000 atoms)



# Next steps: simulations on Summit (Oak Ridge National Lab)



- GPU acceleration
  - Generate DFT training data
  - Run large scale MD simulations out to nanoseconds, e.g. 10 million atoms on 256 nodes can run 5 ns in ~18 hours
- Geometries
  - Pure W with embedded ZrC
  - Polycrystalline W with embedded ZrC
  - Bicrystals of expected W-ZrC interfaces from experiment and DFT
- Investigate
  - Accommodation of strain at ITER temperatures
  - Effect of ZrC on thermal expansion

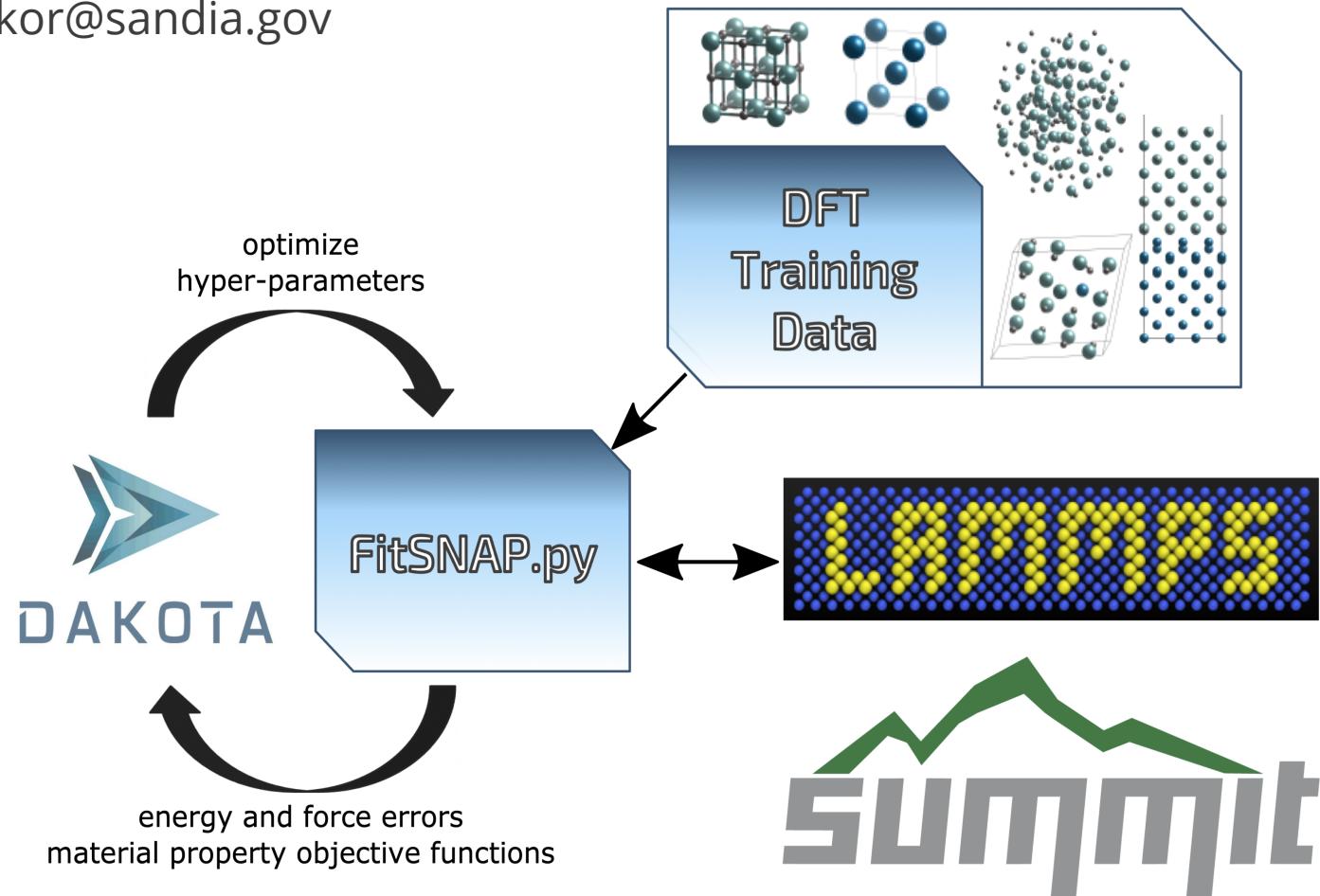


**Spherical ZrC in crystalline W (~10 million atoms)**

# Thank you for your time.



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