

# High-throughput database for the surface properties of elemental solids

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## Motivation

- Work function and surface energy can explain surface phenomena such as crystal growth and used in the design of devices such as catalysis and Schottky barriers.
- A comprehensive/standardized database of these properties is needed to develop a general model for such phenomena and screen for optimal functional materials.
- Constructed the world's largest open, rigorously validated database for surface properties using high-throughput DFT calculations.

## Surface energy ( $\gamma$ ) and Wulff shapes

### Methods:

- For facets:**  $\gamma_{hkl}^{DFT} = \frac{E_{slab}^{hkl} - E_{bulk}^{hkl} n_{slab}}{2A_{slab}}$ ,  $\gamma_{hkl}^{BB} = E_{coh} \frac{N_{bb}}{CN} \frac{1}{2A_{slab}}$
- Weighted value:**  $\bar{\gamma} = \sum_{hkl} \gamma_{hkl} f_{hkl}^A$ , where  $f_{hkl}^A$  is a fractional area on the Wulff shape

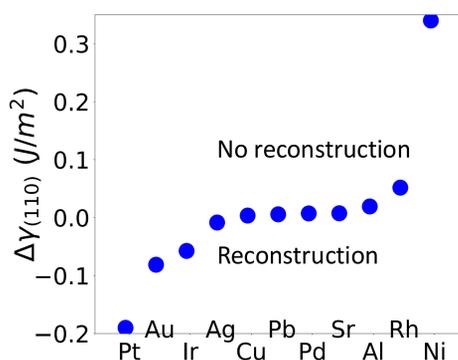
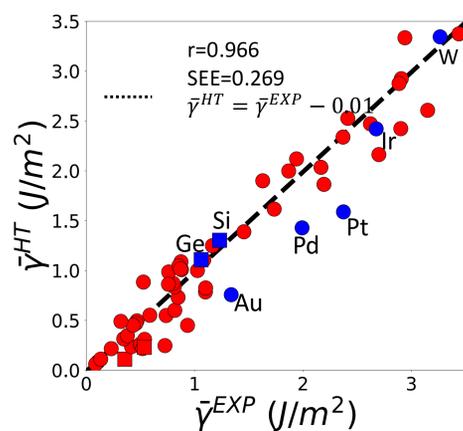


Fig 1. (top) Reconstruction energy for the fcc (110) 2x1 missing-row. ( $\Delta\gamma_{110} = \gamma_{110}^{reconstruct} - \gamma_{110}^{relax}$ )



### Validation:

- $\bar{\gamma}^{HT}$  compares well with values obtained from liquid surface tension measurements ( $\bar{\gamma}^{EXP}$ ).
- An accurate estimate of the Wulff shape is shown to require  $\gamma_{hkl}$  of max Miller index (MMI) greater than 1.
- Surface reconstructions found in the calculations are confirmed in experiments.
- In agreement with previously computed data (2-13% difference).

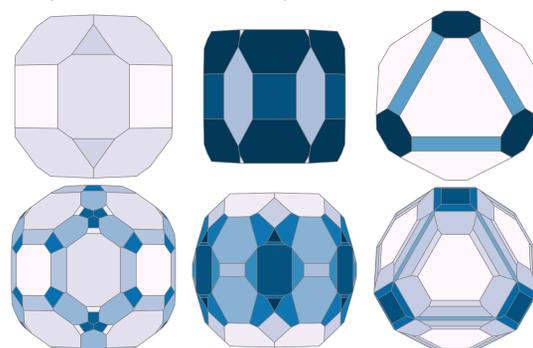
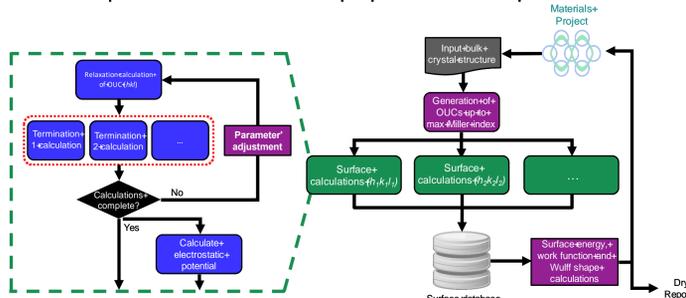


Fig 2 (top). Wulff shapes of Fe (left), Hf (center) and Pt (right) with an MMI of 1 (top) and MMI>1 (bottom).

Fig 3. (left) The calculated  $\bar{\gamma}^{HT}$  provides an excellent estimate for  $\bar{\gamma}^{EXP}$  measured using a sessile drop technique.

## Workflow and database

Fig 4. Schematic of the high-throughput infrastructure. Dashed blocks represent work flow steps performed in parallel.



### Database includes:

- Surface properties of over 142 crystals of over 72 elements.
- Metals and non-metals.
- Elemental solid polymorphs available on MP.
- Facets of MMI up to 2 and 3 for all non-cubic and cubic crystals respectively.
- Well-known surface reconstructions.

### Methods:

- DFT calculations were performed using the generalized gradient approximation (GGA) Perdew-Burke-Ernzerhof (PBE) functional.
- All slabs have a minimum slab and vacuum thickness of 10 Å.
- Automated high-throughput workflow implemented using the FireWorks library.

## Work function ( $\Phi$ )

### Methods:

- For facets:**  $\Phi_{hkl} = V_{vac} - E_f$  where  $E_f$  is the Fermi energy and  $V_{vac}$  is the electrostatic potential at the vacuum region of the slab.
- Weighted work function:**  $\bar{\Phi} = \frac{\sum_{hkl} \Phi_{hkl} A_{hkl}}{\sum A_{hkl}} = \sum_{hkl} \Phi_{hkl} f_{hkl}^A$ , provides an estimate for polycrystalline work functions.
- We modelled  $\bar{\Phi}$  for metals using linear regression with a Pauling electronegativity to metallic radius ratio  $X/R$ .

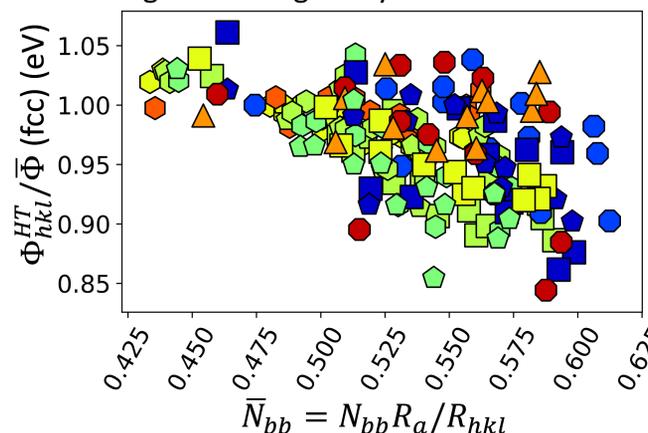


Fig 6. Work function of fcc metals vs number of broken bonds ( $N_{bb}$ ) (normalized).  $\Phi_{hkl}^{HT}$  is negatively correlated to  $N_{bb}$  for most metals in accordance with Smoluchowski smoothing.

### Validation and modelling:

- $\bar{\Phi}$  compared well to experimental values obtained from polycrystalline specimens ( $\Phi_{poly}^{EXP}$ ). DFT values are on average lower.
- Results of different functionals compared well with our values ( $r > 0.9$  with LDA, GGA-PBE and RPBE).
- Most systems follow Smoluchowski smoothing<sup>3</sup> for work function when plotting  $\Phi_{hkl}$  against the number of broken bonds.
- $X/R$  is an excellent descriptor for  $\bar{\Phi}$  (metals). This ratio is analogous to the charge to distance ( $Q/R$ ) ratio of Gauss's Law for the potential of a conducting sphere.

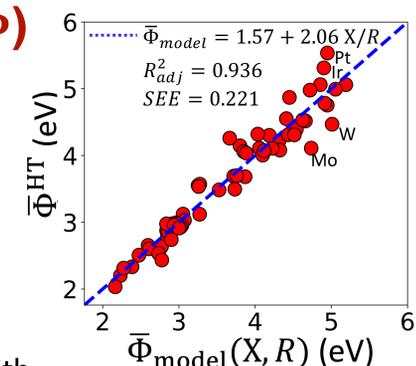


Fig 5. (top) Linear regression with  $X/R$  provides an excellent model for average metallic work function ( $\bar{\Phi}$ ).

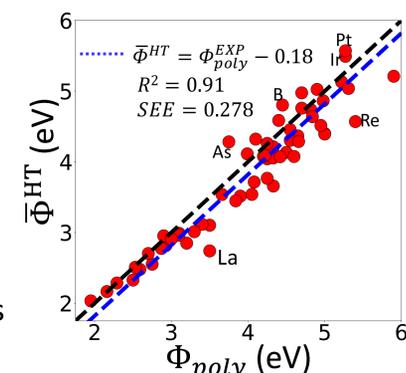


Fig 7. (top)  $\bar{\Phi}^{HT}$  provides an estimate for experimental values of polycrystals ( $\Phi_{poly}$ )

## Conclusions

- We developed new method of comparing calculated values of work function ( $\Phi_{hkl}$ ) and surface energy ( $\gamma_{hkl}$ ) to experimental values obtained from polycrystals ( $\Phi_{poly}$ ) and liquid surface tension measurements ( $\bar{\gamma}^{EXP}$ ) by using a weighted average based on the Wulff shape geometry.
- Our data was validated using previous DFT and experimental values and follows well-known trends such as reconstruction and Smoluchowski smoothing.
- We developed a model to predict  $\bar{\Phi}$  for metals using atomic parameters.

## References

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