

Fall 10-1-2012

# Materials Design Based on Ab Initio Thermodynamics

Jorg Neugebauer  
*Max Planck Institut*

Fritz Kormann  
*Max Planck Institut*

Blazej Grabowski  
*Max Planck Institut*

Tilman Hickel  
*Max Planck Institut*

Dierk Raabe  
*Max Planck Institut*

Follow this and additional works at: [http://dc.engconfintl.org/materials\\_genome](http://dc.engconfintl.org/materials_genome)



Part of the [Biomedical Engineering and Bioengineering Commons](#)

---

## Recommended Citation

Jorg Neugebauer, Fritz Kormann, Blazej Grabowski, Tilman Hickel, and Dierk Raabe, "Materials Design Based on Ab Initio Thermodynamics" in "Harnessing The Materials Genome: Accelerated Materials Development via Computational and Experimental Tools", J.-C. Zhao, The Ohio State Univ.; M. Asta, Univ. of California Berkeley; Peter Gumbsch Institutsleiter Fraunhofer-Institut fuer Werkstoffmechanik IWM; B. Huang, Central South University Eds, ECI Symposium Series, (2013). [http://dc.engconfintl.org/materials\\_genome/2](http://dc.engconfintl.org/materials_genome/2)

This Conference Proceeding is brought to you for free and open access by the Proceedings at ECI Digital Archives. It has been accepted for inclusion in Harnessing The Materials Genome: Accelerated Materials Development via Computational and Experimental Tools by an authorized administrator of ECI Digital Archives. For more information, please contact [franco@bepress.com](mailto:franco@bepress.com).

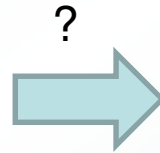
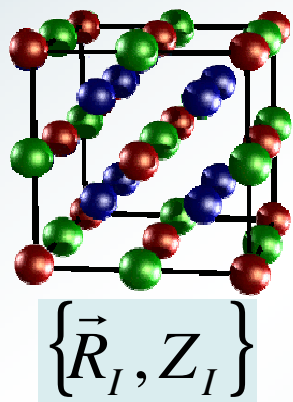


# Materials Design Based on Ab Initio Thermodynamics

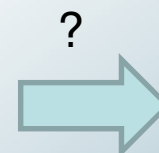
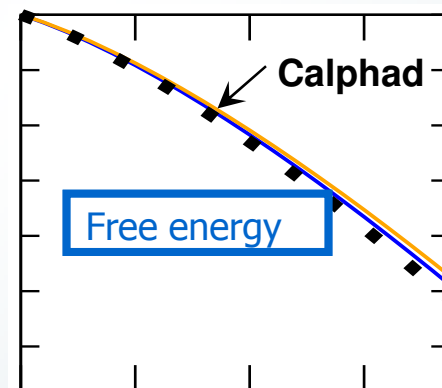
Jörg Neugebauer, Fritz Körmann, Blazej Grabowski, Tilmann Hickel,  
and Dierk Raabe

*Max-Planck-Institut für Eisenforschung, Düsseldorf, Germany*  
*Department: Computational Materials Design*

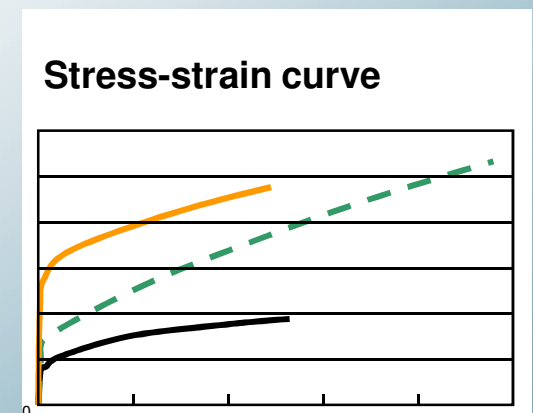
“Genome”



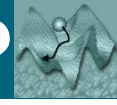
Ab initio thermodynamics



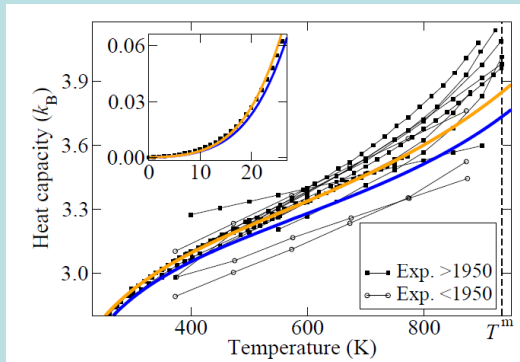
Engineering properties



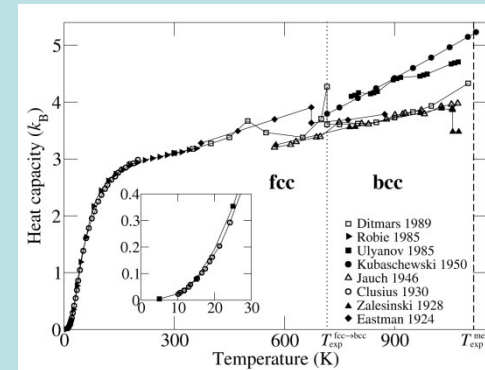
# Do we have to go beyond experiment?



## Calorimetric measurements



fcc Al



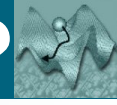
fcc/bcc Ca

Fundamental input for all thermodynamic databases  
 → But: Scatter of  $\sim 0.3 \dots 1 k_B$

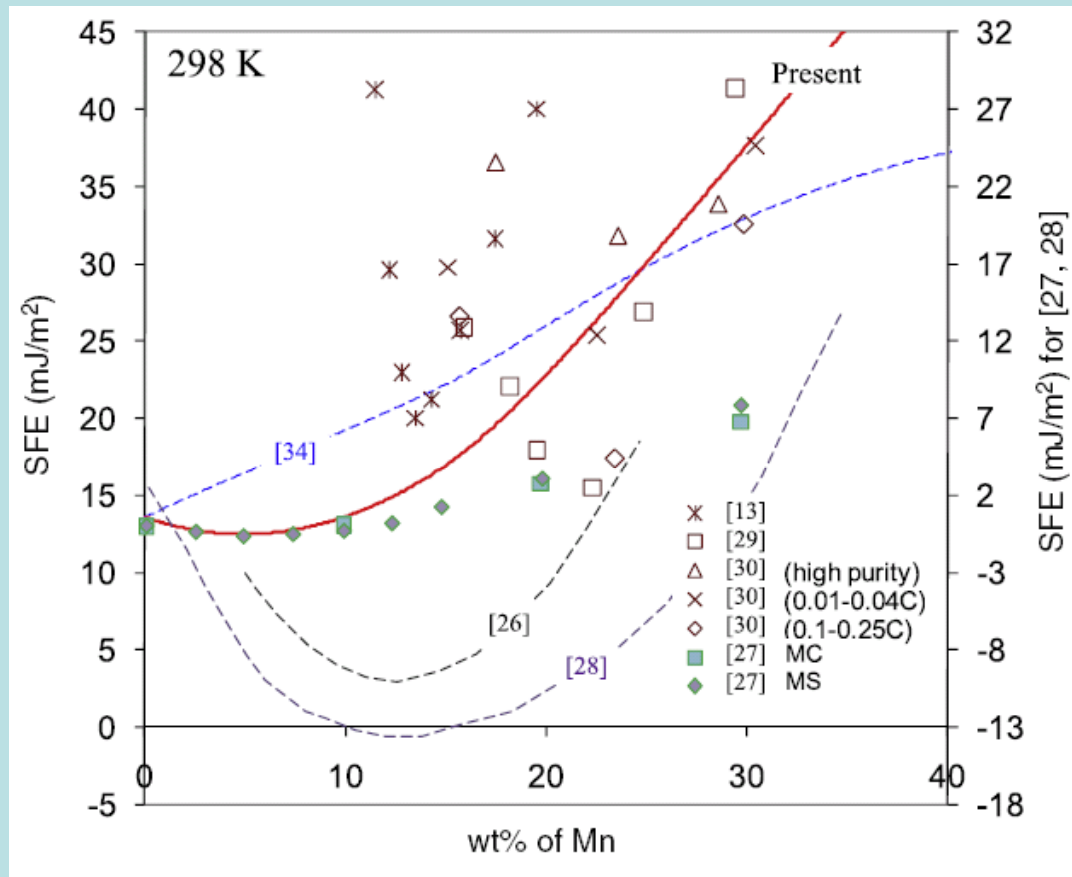
## Point defects (vacancies): Formation energies and entropies

	Al		Cu	
	Exp.	DFT	Exp.	DFT
$E_f$ (eV)	0.7	0.6	1.2	0.9
$S$ ( $k_B$ )	2.4	0.2	2.3	0.3

# Do we have to go beyond experiment?



## Stacking fault energies (fcc Fe-Mn)



Key quantity to design novel high-strength steels

Additional complication  
→ magnetism

Even chemical trends are hard to derive from existing data

# Ab initio computed Free energies

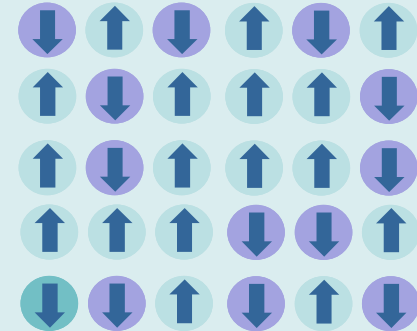


## Approach (schematic):

Energy for any configuration/phase can be computed:

$$E_{tot} \left( \left\{ \vec{R}_I, Z_I, \vec{\sigma}_I, f_i, \dots \right\} \right)$$

→ applicable to any system: bulk, surface, nano, ...



All possible excitation mechanisms can be described:

→ vibrational, magnetic, electronic, chemical, ...

Statistical averages provide thermodynamic quantities:

$$Z(V, T, x) = \left\langle e^{-E^{BOS}(\{\vec{R}_I, Z_I, \sigma_I, f_i, \dots\}_V) / k_B T} \right\rangle_{V, T, x}$$

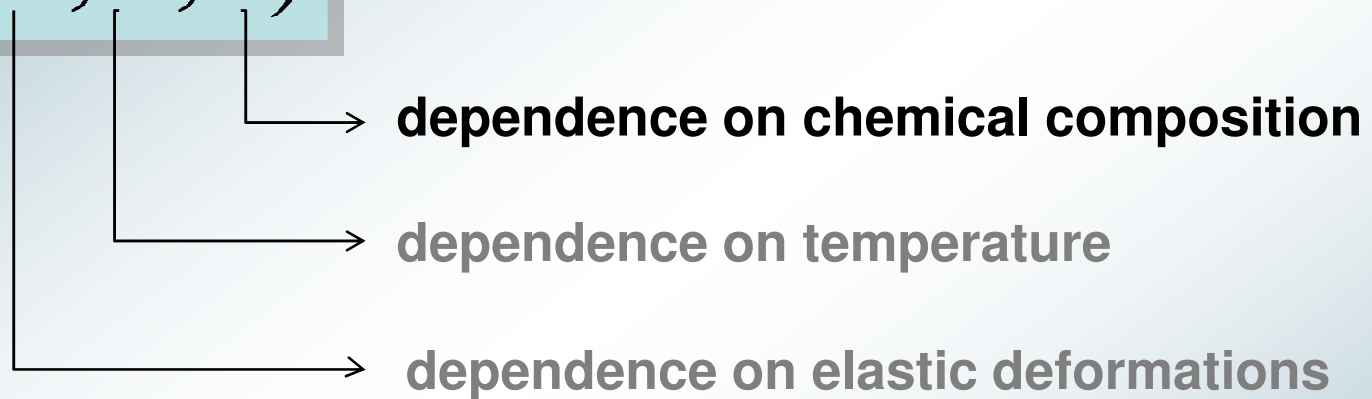
Knowledge of partition function allows to derive any thermodynamic quantity!

# Accuracy



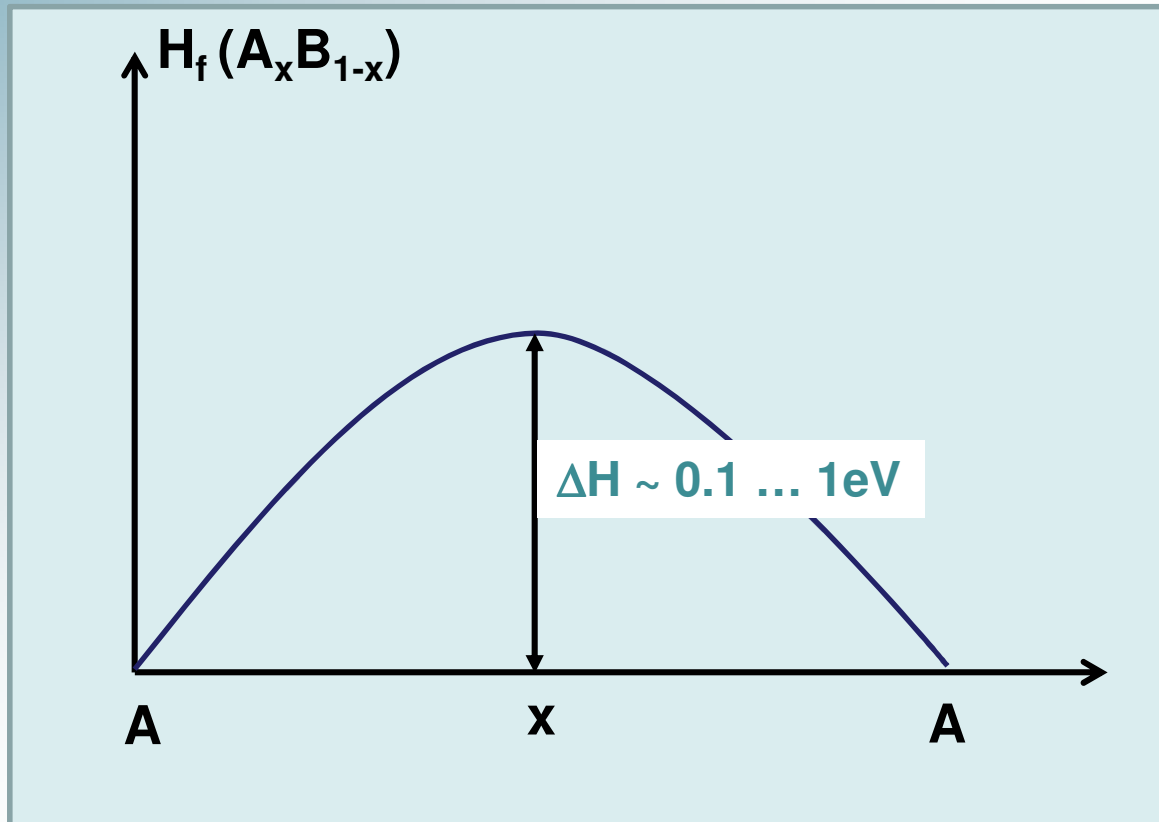
Free energy:

$$F(V, T, x)$$





## Alloy formation enthalpy



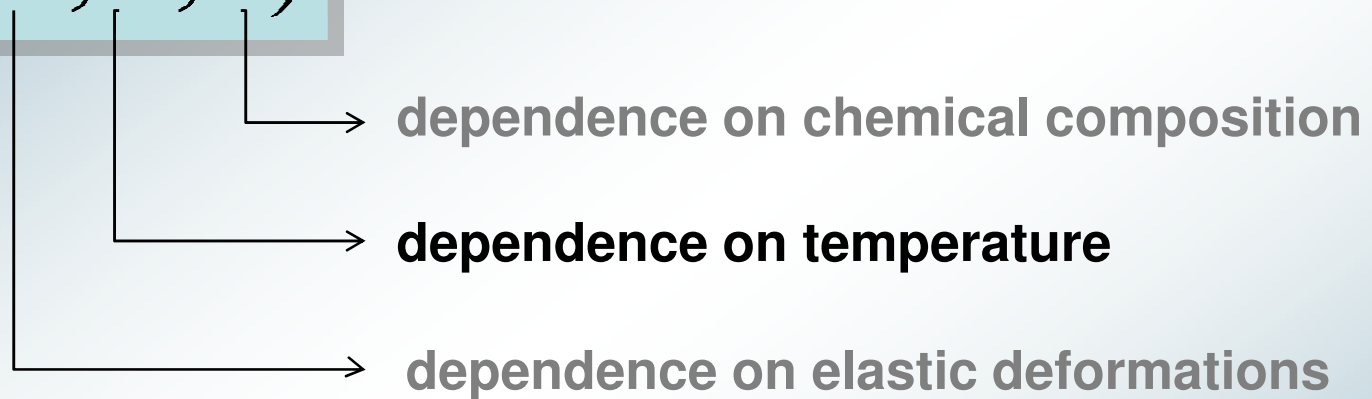
Errors in the order of 10meV are often acceptable  
→ DFT provides reliable results

# Accuracy



Free energy:

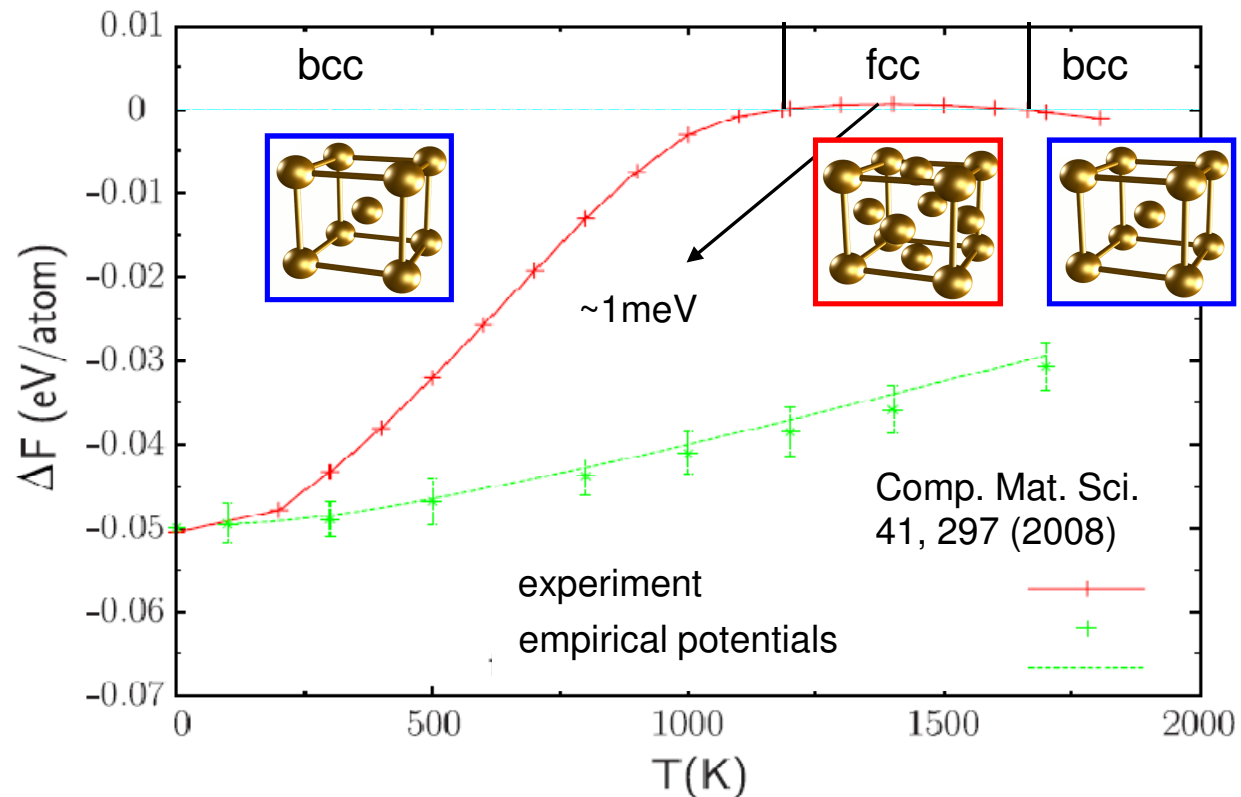
$$F(V, T, x)$$







## Free energy difference between bcc and fcc iron



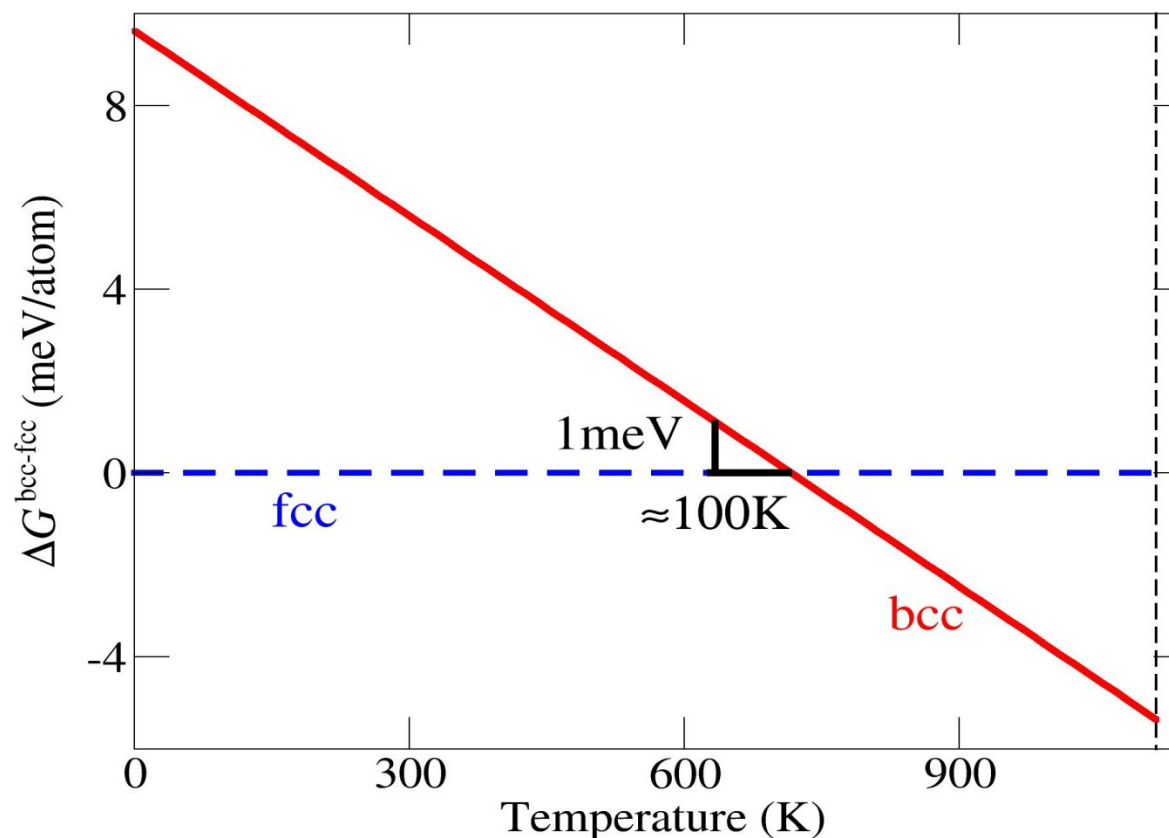
**Energy resolution better 1 meV!**

→ **Can we achieve such accuracy with present day ab initio techniques?**

# Free energies: What accuracy is needed?



## Free energy difference between bcc and fcc calcium

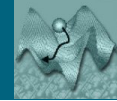


Target:

Numerical precision < 1 meV

→ remaining error purely due to xc-functional

# Ab initio Thermodynamics



$$Z(\hat{A}, T) = \sum_{\{\vec{R}_I\}_{\hat{A}}} e^{-E^{BOS}(\{\vec{R}_I, Z_I\}_{\hat{A}})/k_B T}$$

$10^7$  configurations  
a few hours

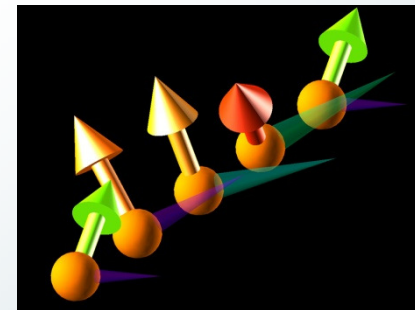
# Ab initio Thermodynamics



Approach (schematic)

$$E^{\text{BOS}}(\{\vec{R}_I, Z_I\}) = E_{\sigma}^{\text{min}} + E_{\sigma}^{\text{harm}} + E_{\sigma}^{\text{anharm}} + \dots$$

- electronic excitations:  $E^{\text{el}}$
- magnetic excitations:  $E^{\text{mag}}$
- structural excitations
  - intrinsic defects:  $E^{\text{def}}$
  - elastic deformations:  $E^{\text{elast}}$
- + interactions between these contributions
  - electron-phonon interaction
  - magneto-volume effects
  - ...



$10^7$  configurations  
a few hours

$$Z(\hat{A}, T) = \sum_{\{\vec{R}_I, \sigma_I\}_{\hat{A}}} e^{-E^{\text{BOS}}(\{\vec{R}_I, Z_I, \sigma_I, \dots\}_{\hat{A}}) / k_B T}$$

# Methodological Approach



## Quasiharmonic approximation + electronic excitations

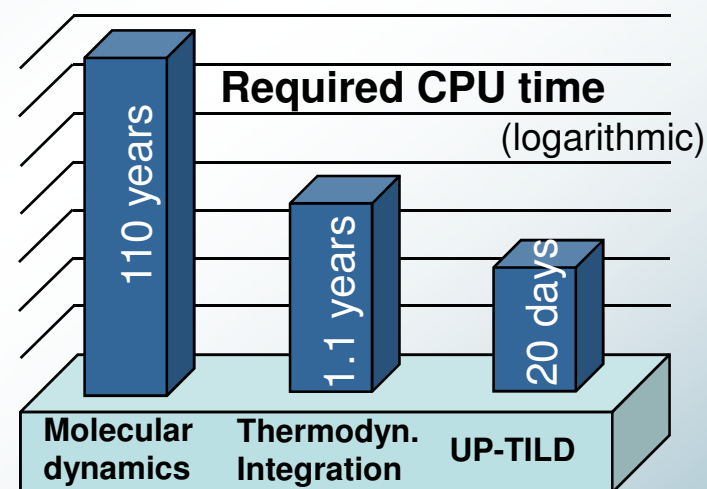
- work horse for free energy studies (typically largest contribution)
- highly sensitive with respect to DFT convergence parameters
- Ref.: Grabowski et al., PRB 76, 024309 (2007).

## Anharmonic contributions:

- relevant close to the melting temperature
- efficient sampling strategies (UP-TILD) boost efficiency by 4 orders of magnitude
- Ref.: Grabowski et al., PRB 79, 134106 (2009)  
PSS-B 248, 1295 (2011)

## Magnetic contributions:

- relevant for practically all steels
- spin-quantization crucial
- Ref.: Körmann et al., PRB 78, 033102 (2008); PRB 83 (2011)  
Uttjewal et al. PRL 102, 035702 (2009).



**Typical numerical precision for free energy: 1 meV**  
Remaining error: xc-functional (LDA, GGA)

# T=0K: Structural and Elastic Properties



## Errors in LDA/GGA(PBE)-DFT computed lattice constants and bulk modulus with respect to experiment



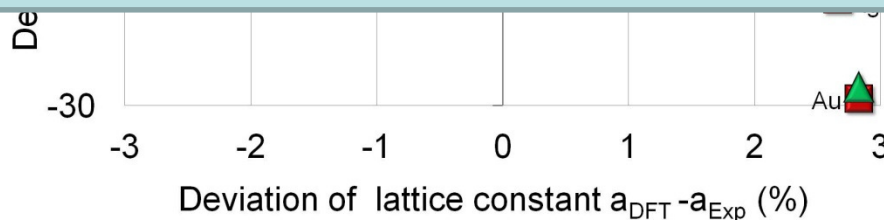
→ Fully converged results  
(basis set, k-sampling,  
supercell size)

**T=0 K errors are not negligible!**

→ Is there any chance that finite temperature properties are accurately predicted?

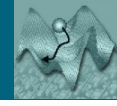
**DFT is well known to interpolate/extrapolate very well (error cancellation)**

→ How good does this work for thermodynamic properties?



bounds to exp. data  
→ provide “ab initio  
error bars”

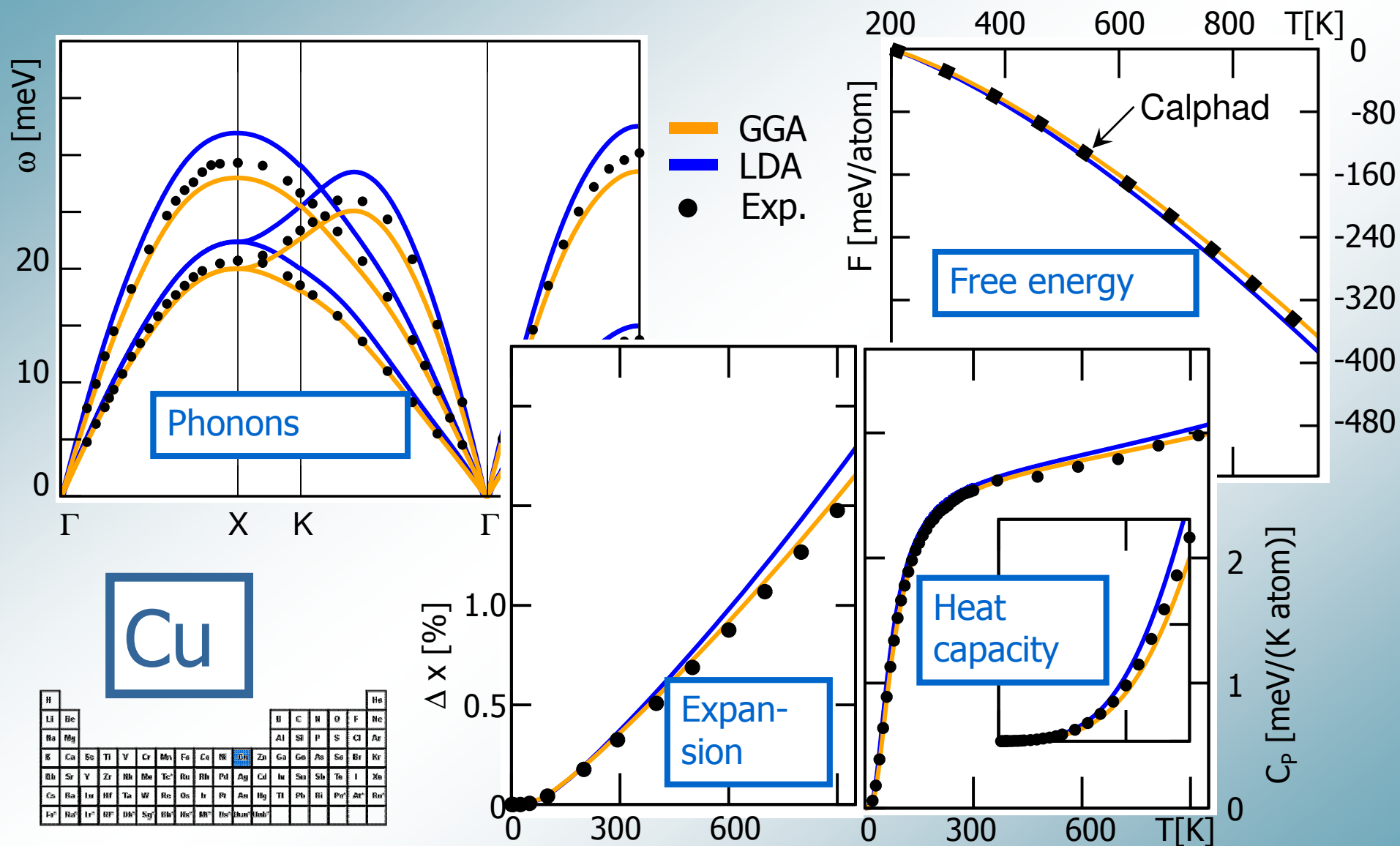
⇒ **Inspection of several xc-functionals is critical to estimate predictive power and error bars!**



# **Non-magnetic materials**

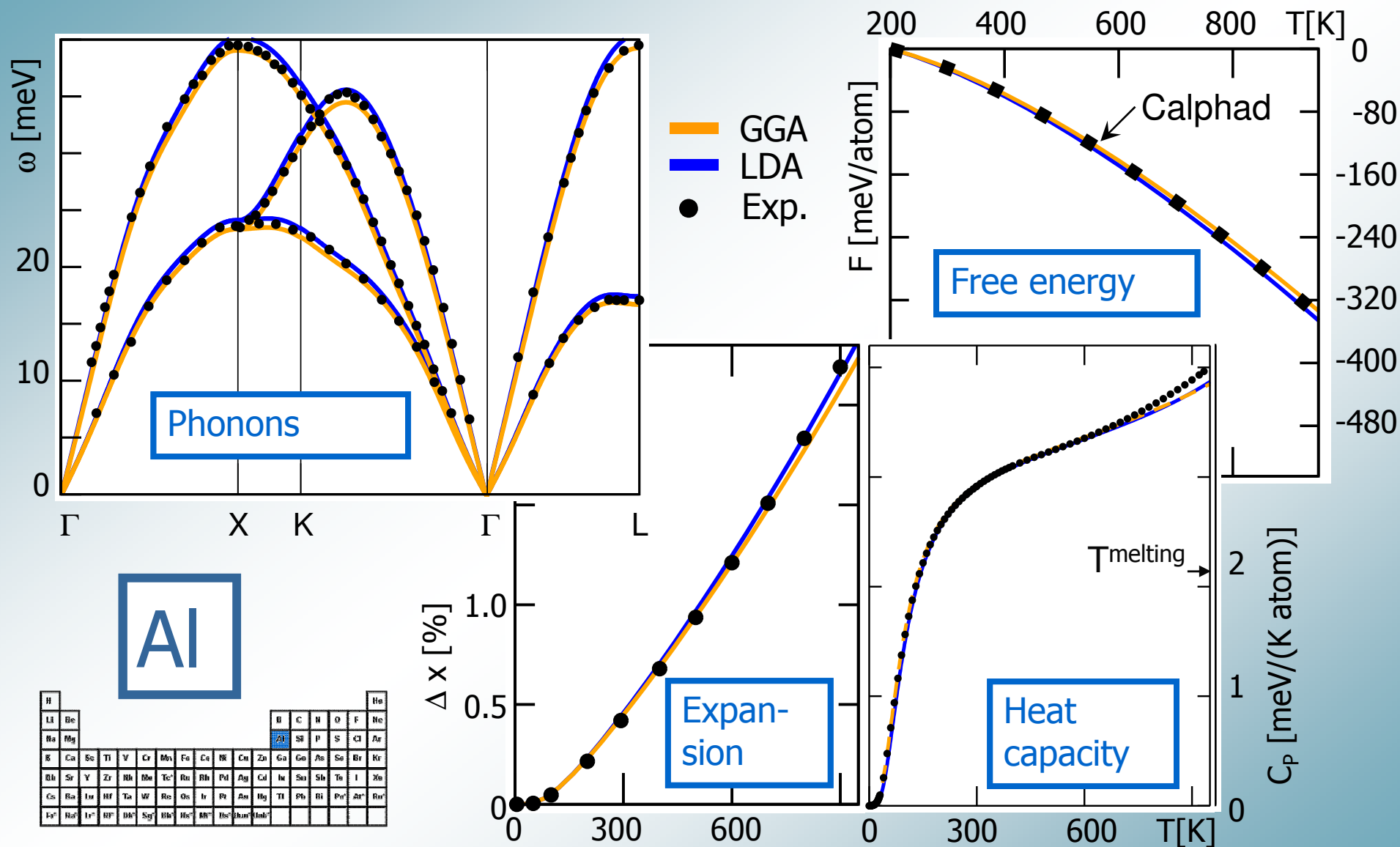
→ **low and medium temperatures**

# Thermodynamic Properties of Cu

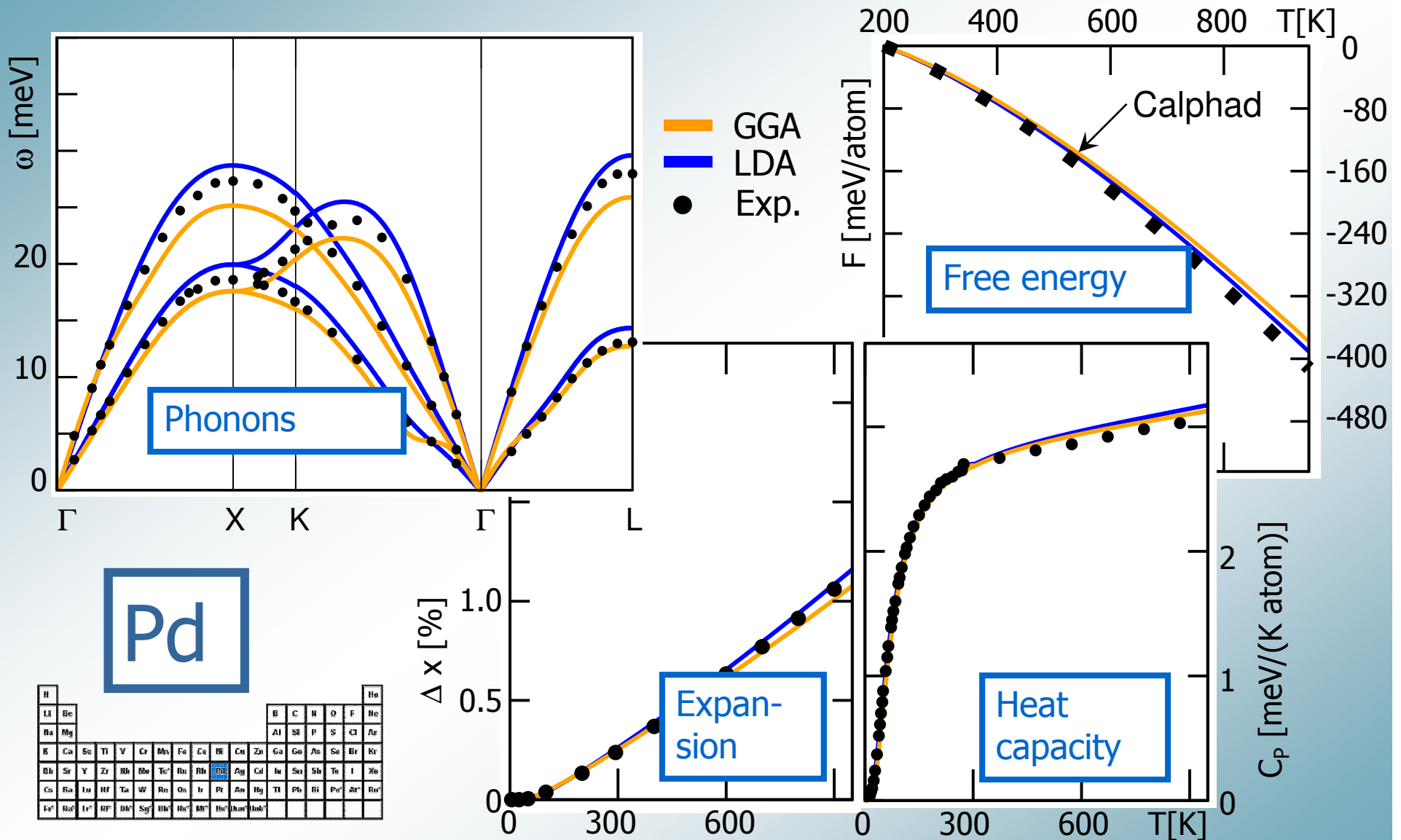




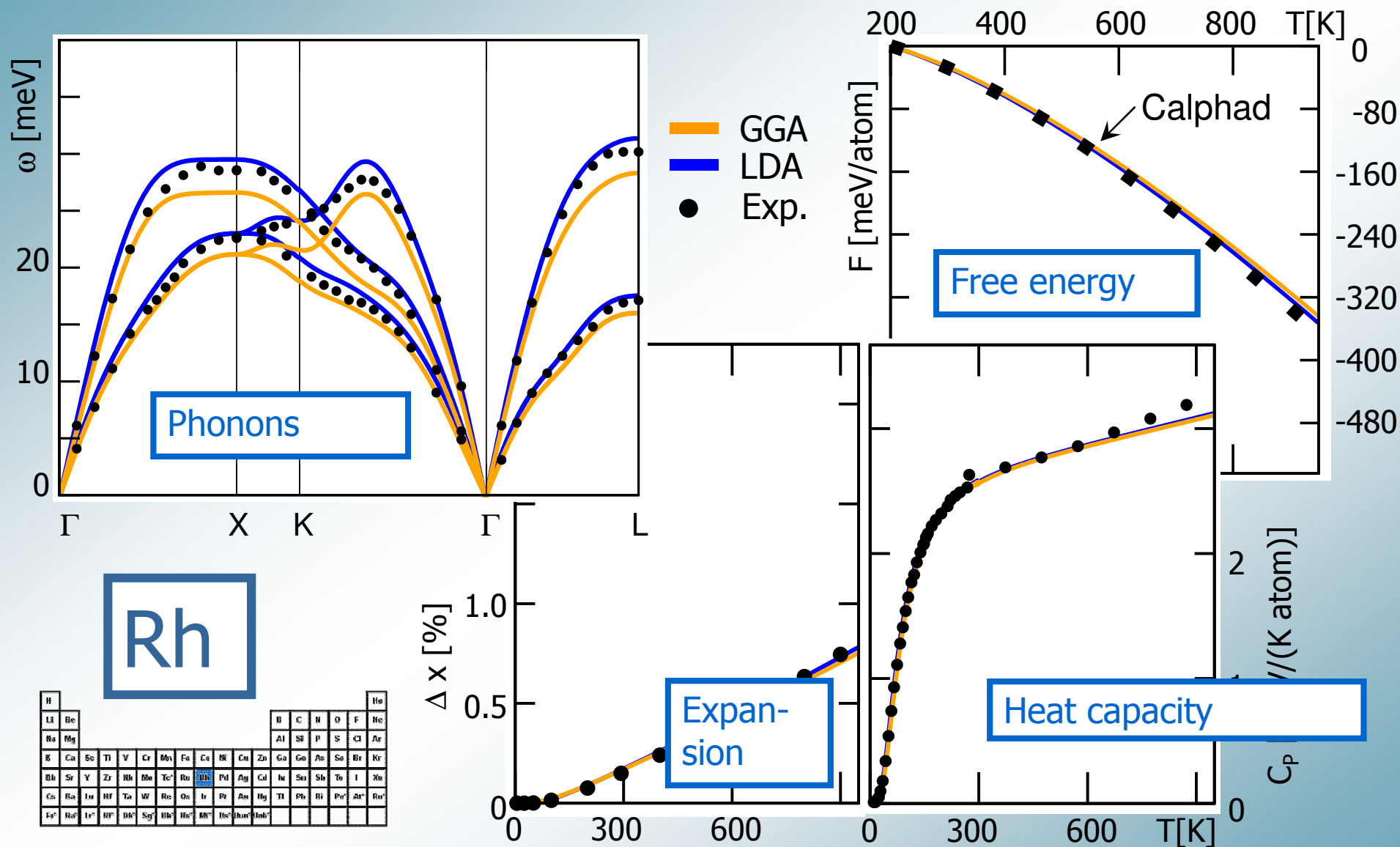
# Thermodynamic Properties of Al



# Thermodynamic Properties of Pd



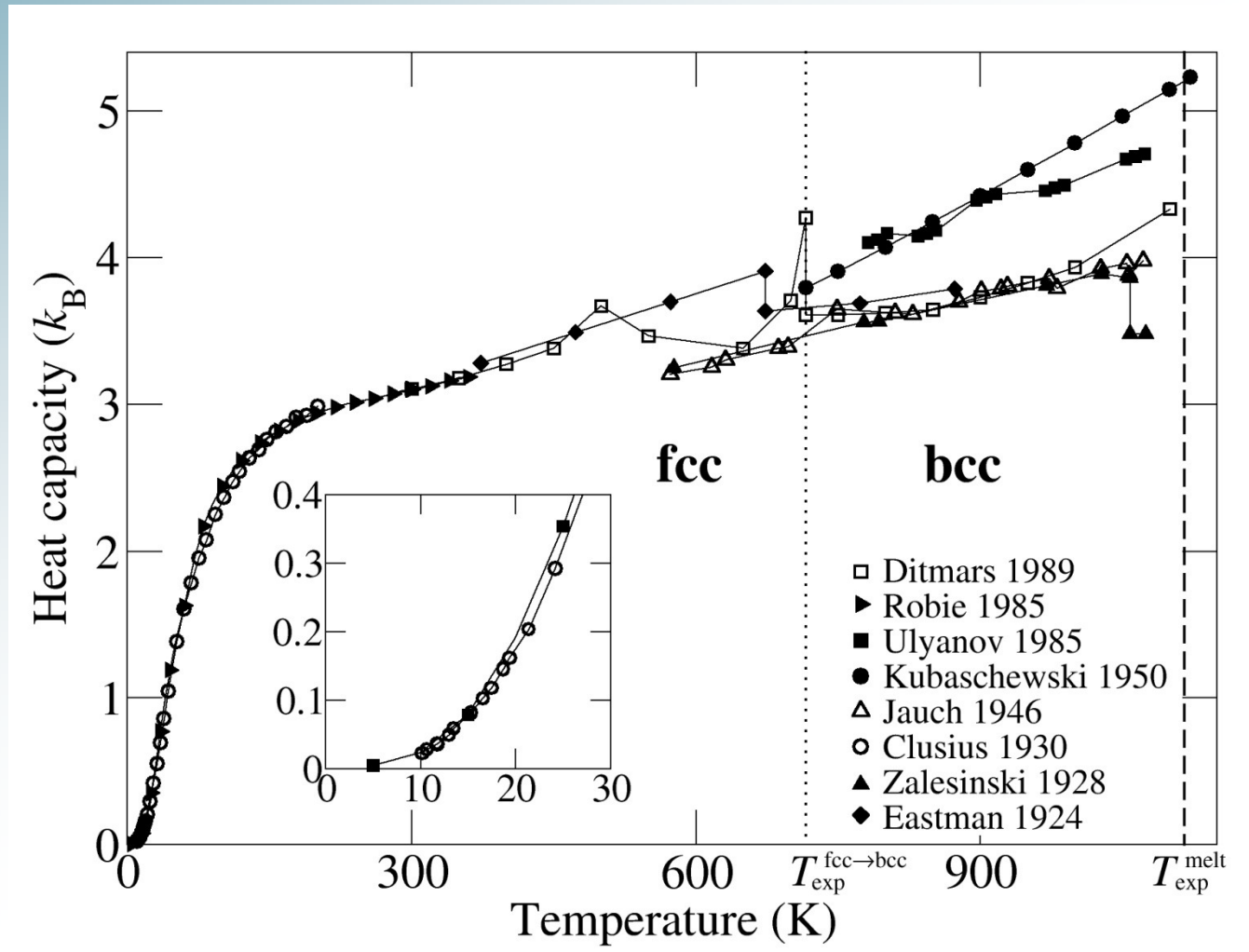
# Thermodynamic Properties of Rh



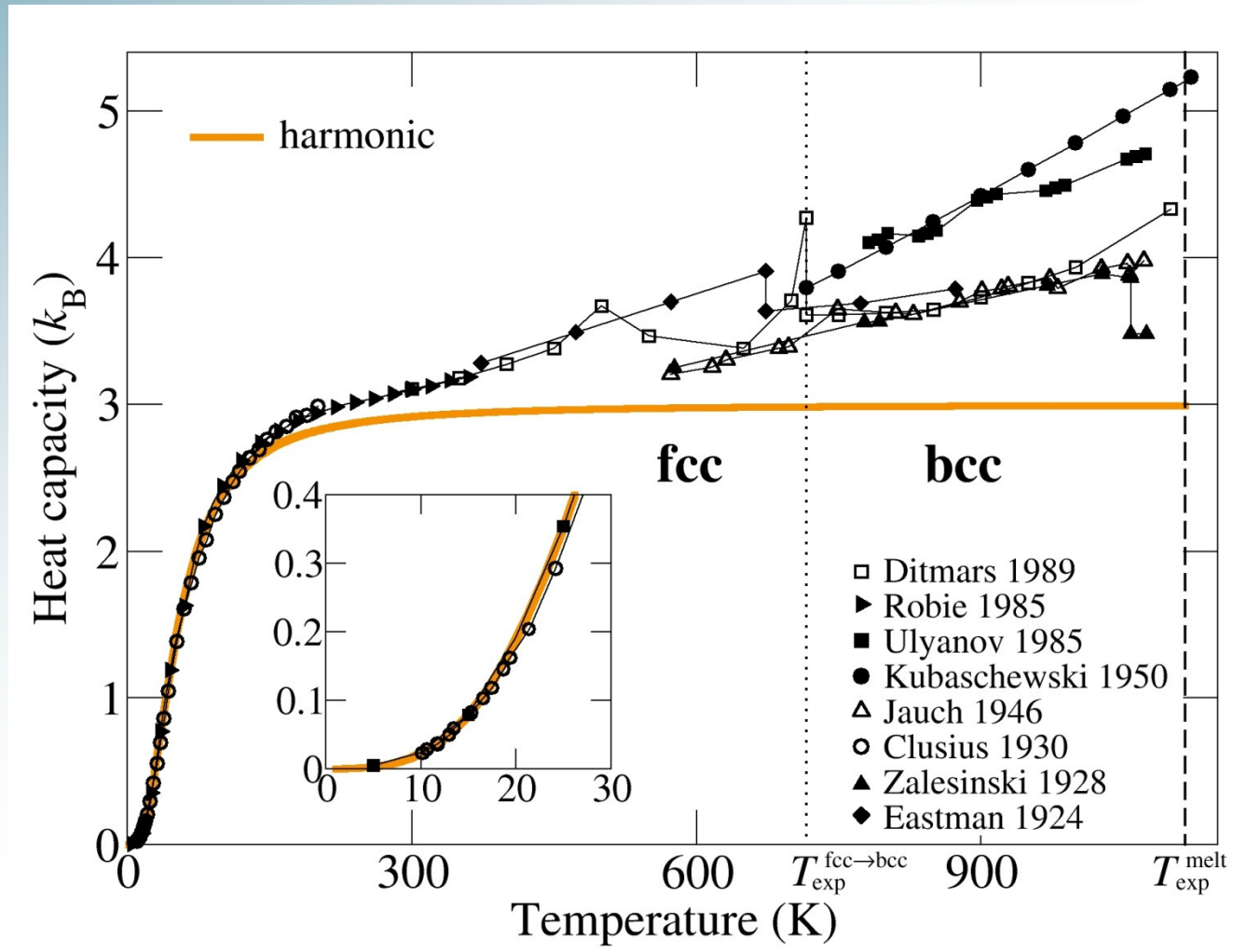


# Applications

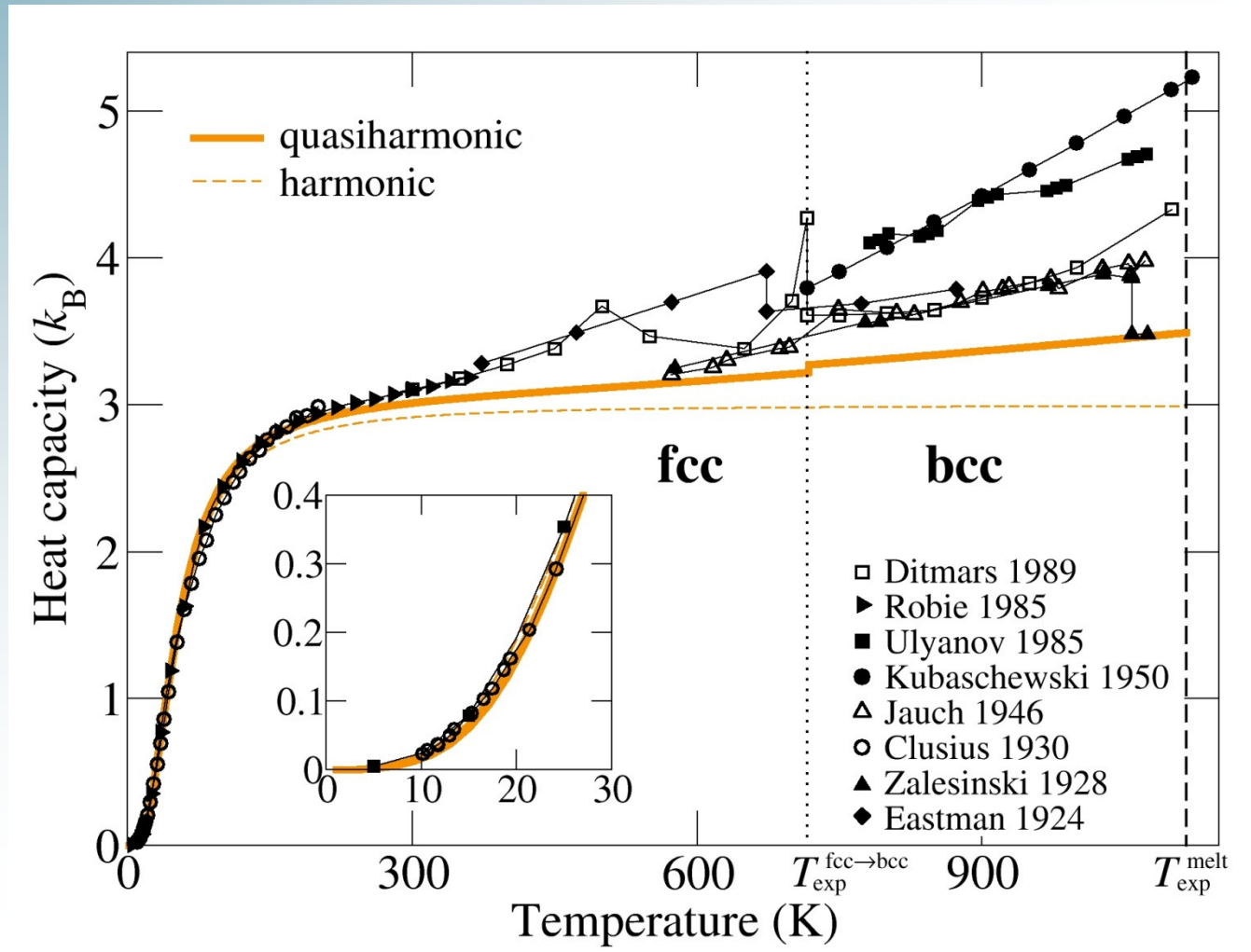
# Calcium: Heat capacity



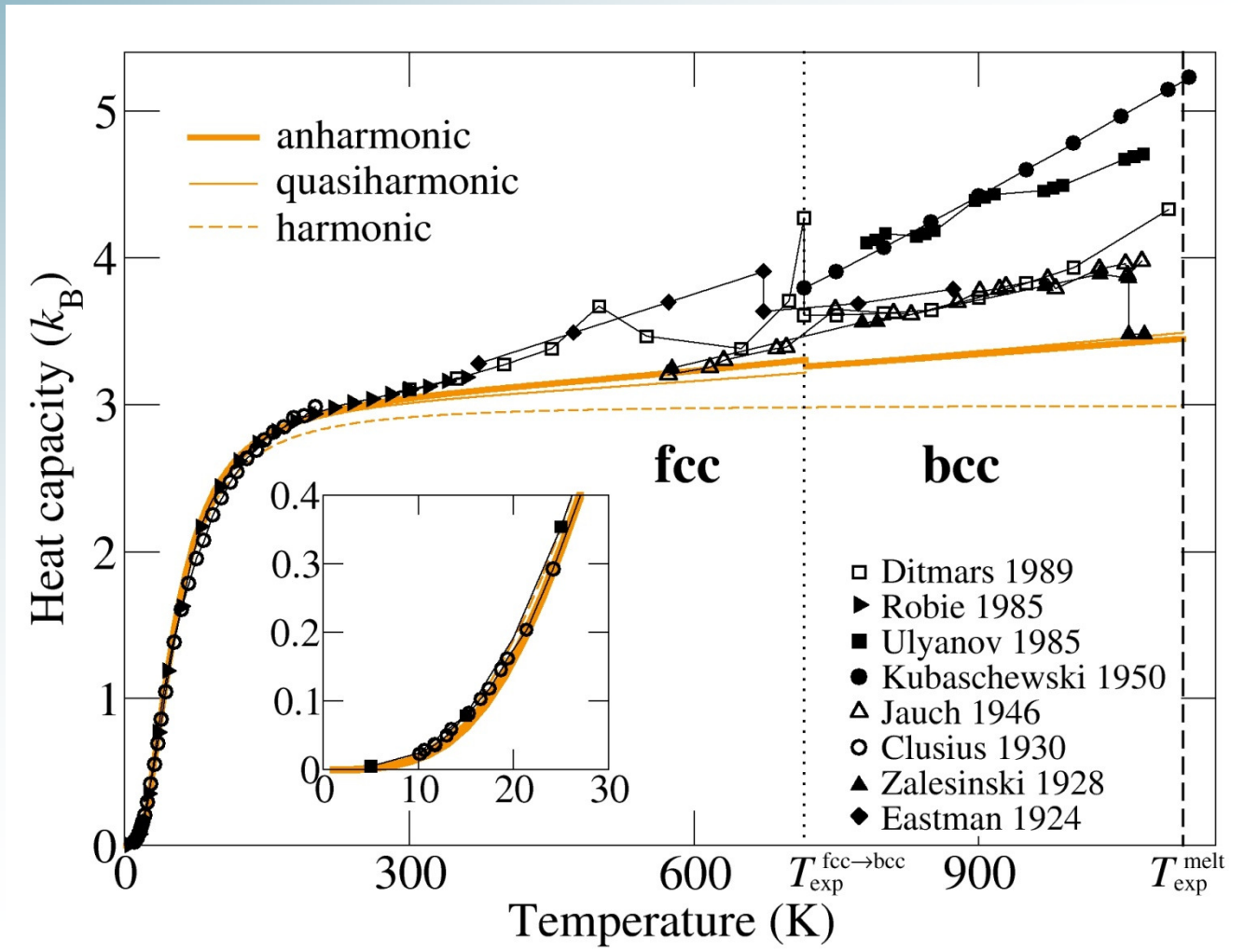
# Calcium: Heat capacity



# Calcium: Heat capacity

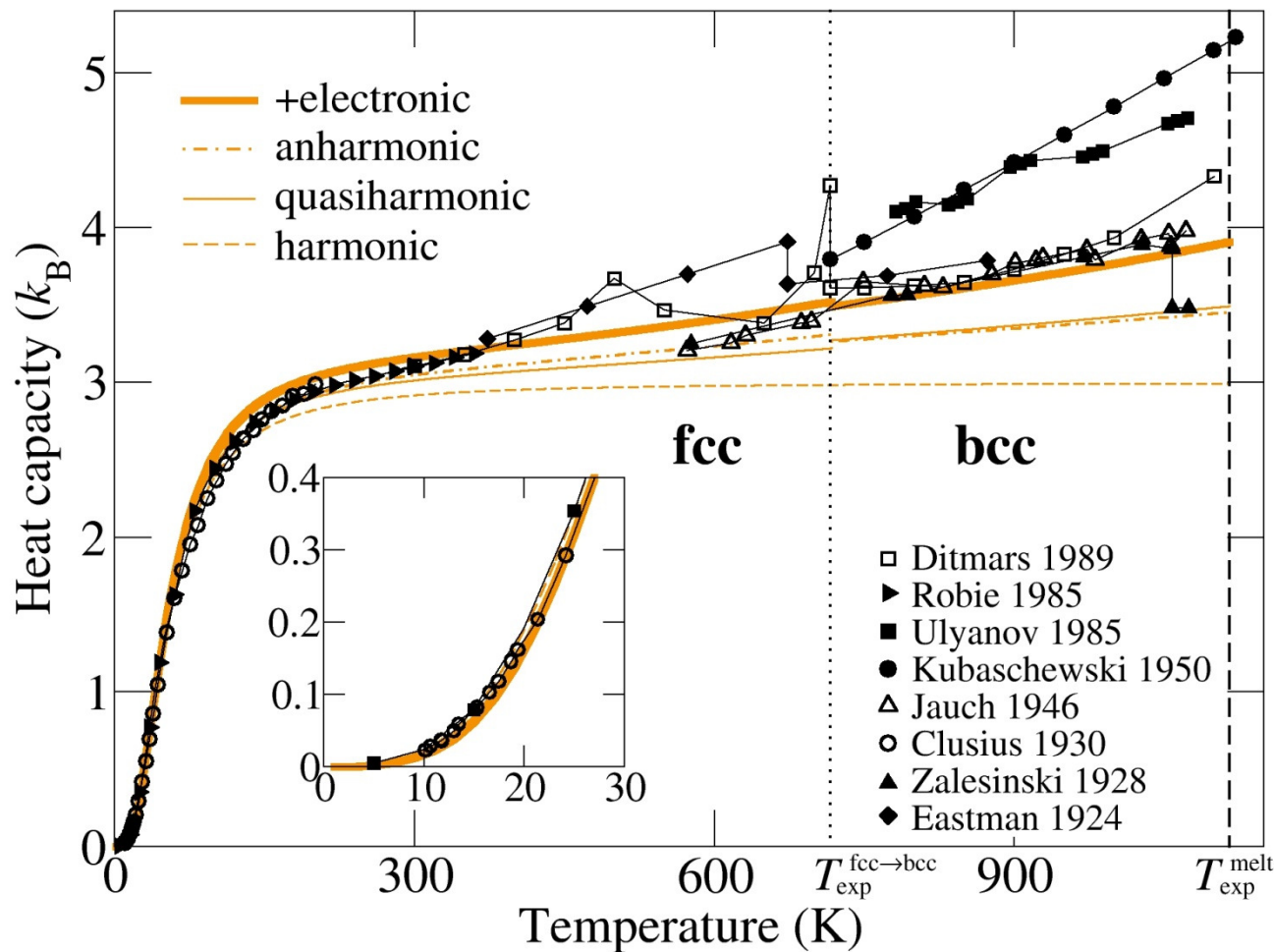


# Calcium: Heat capacity

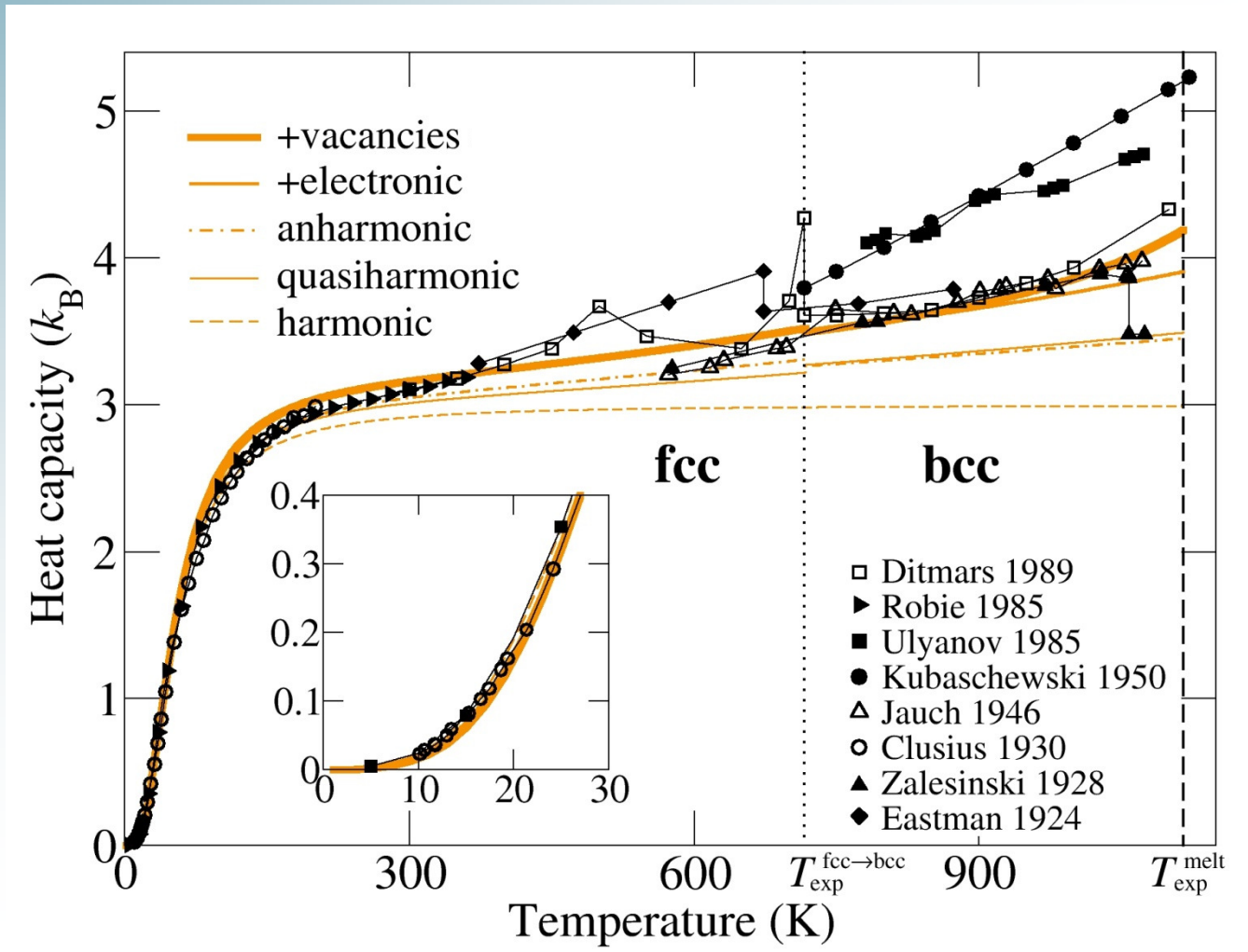




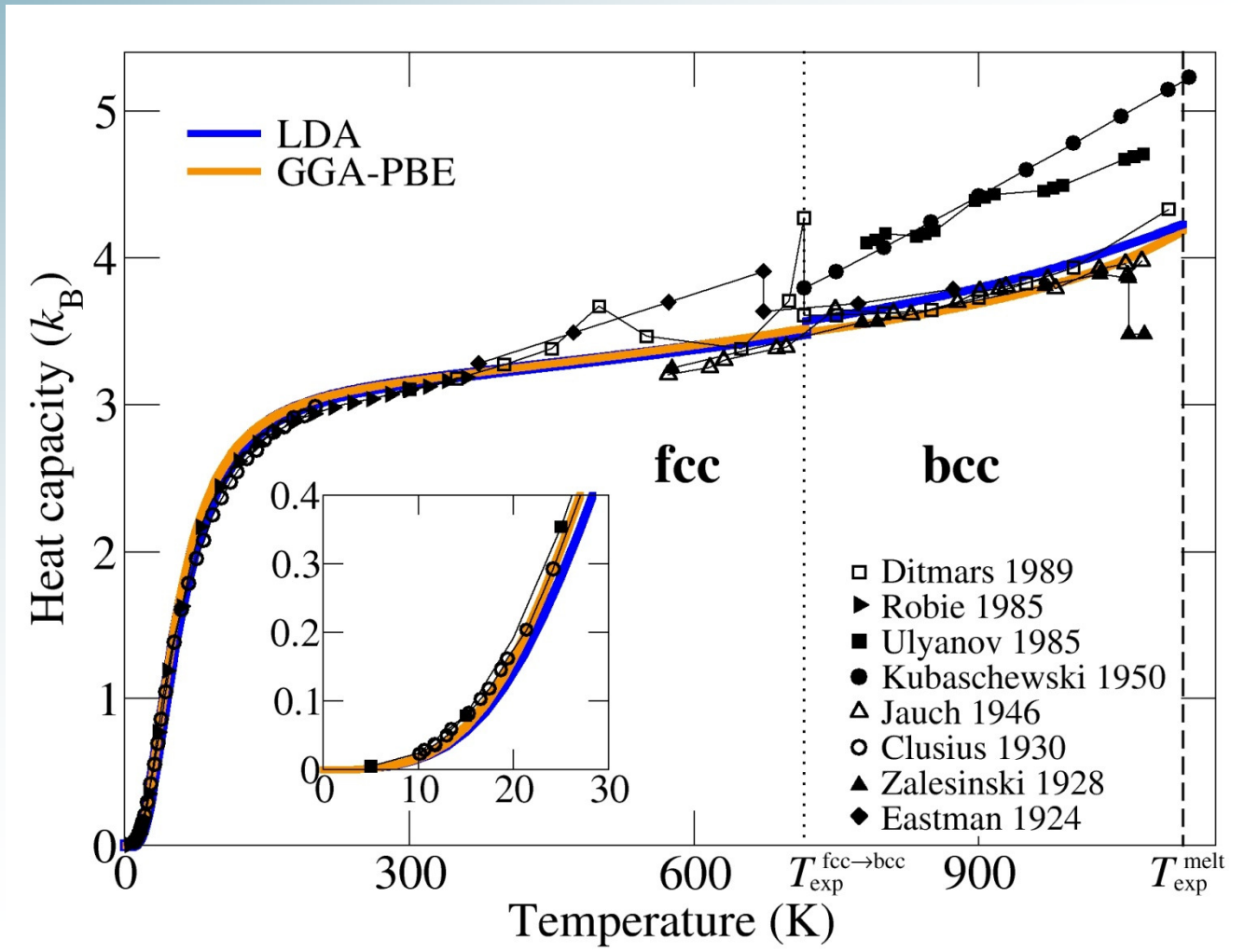
# Calcium: Heat capacity



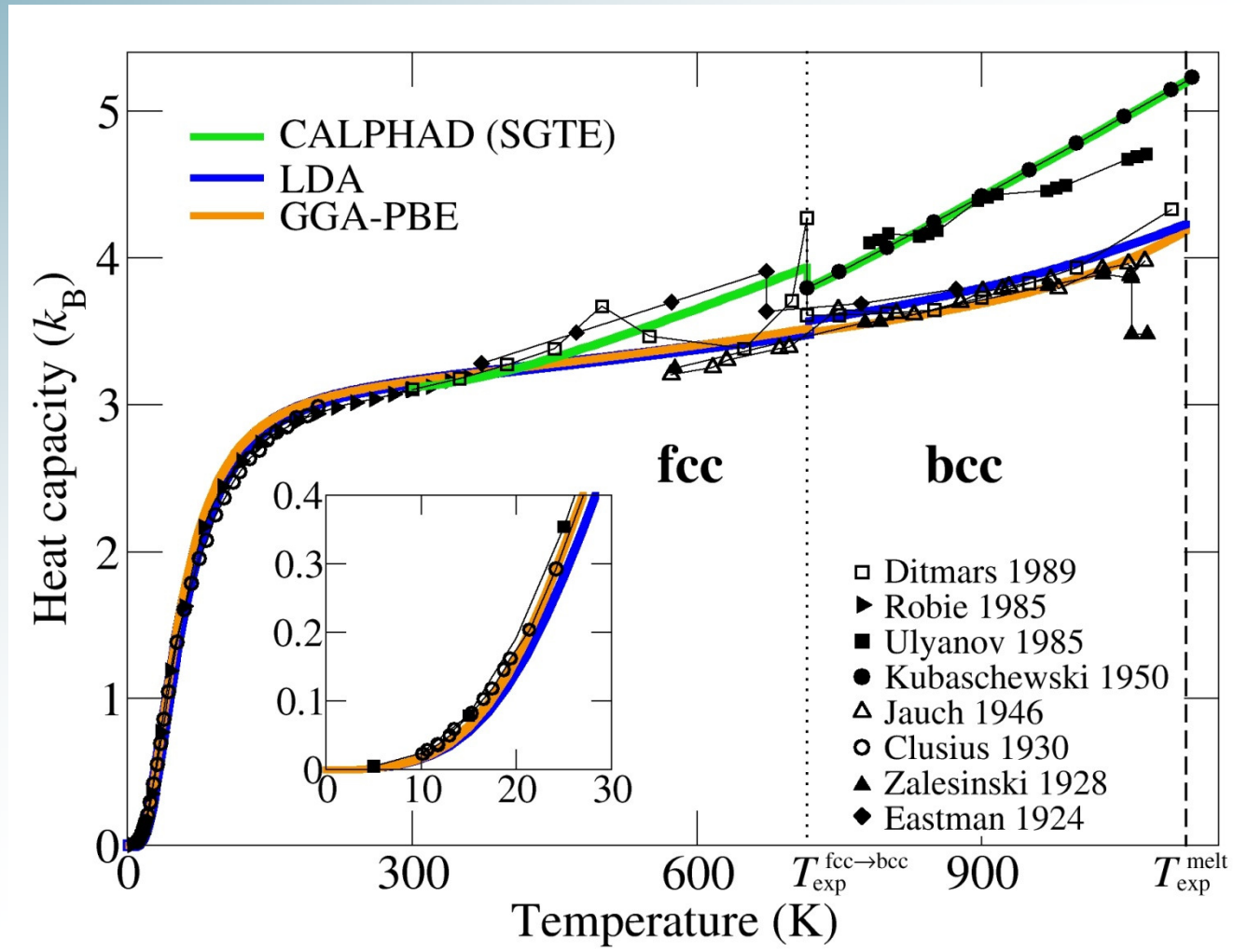
# Calcium: Heat capacity



# Calcium: Heat capacity



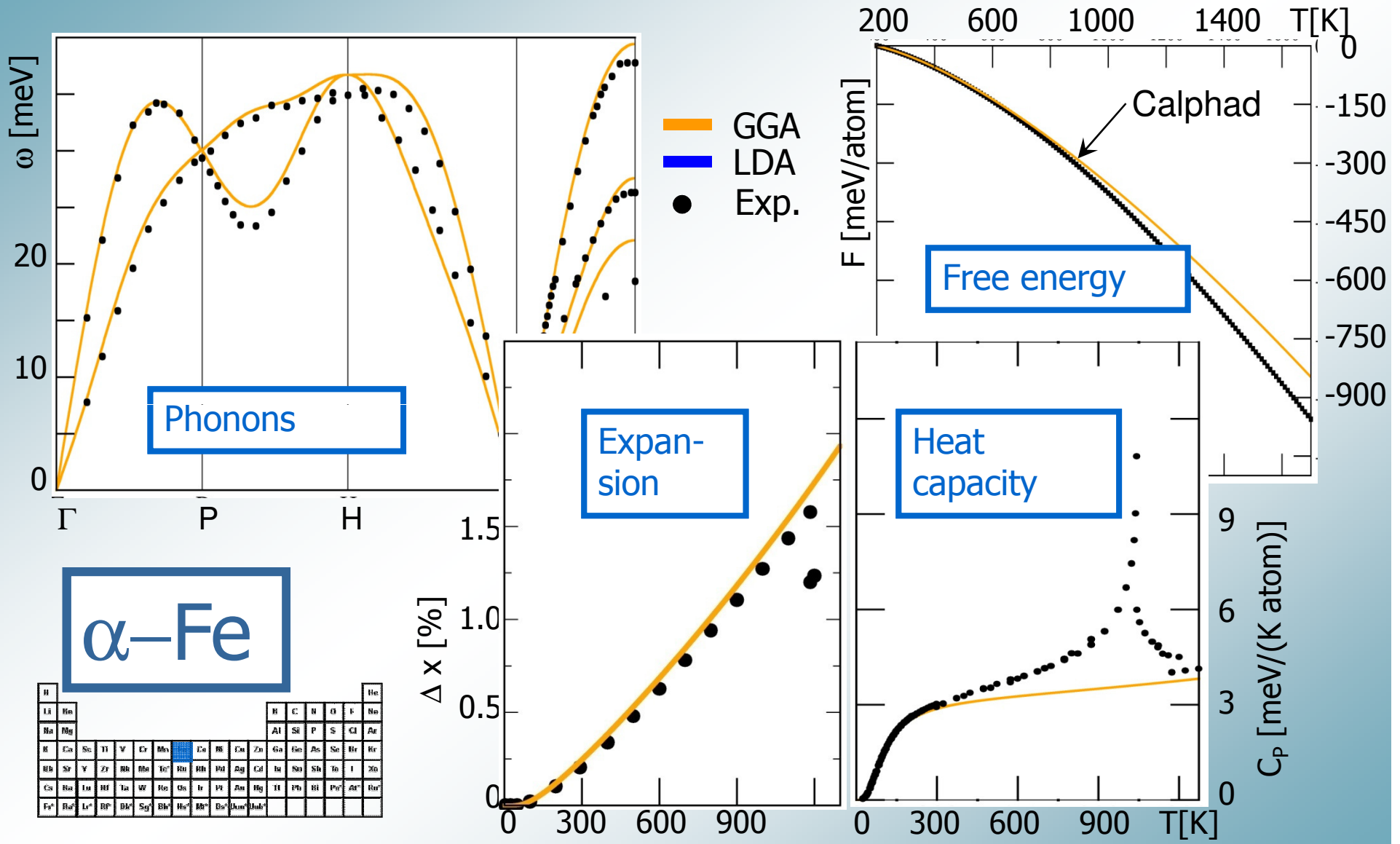
# Calcium: Heat capacity





# Magnetic Excitations

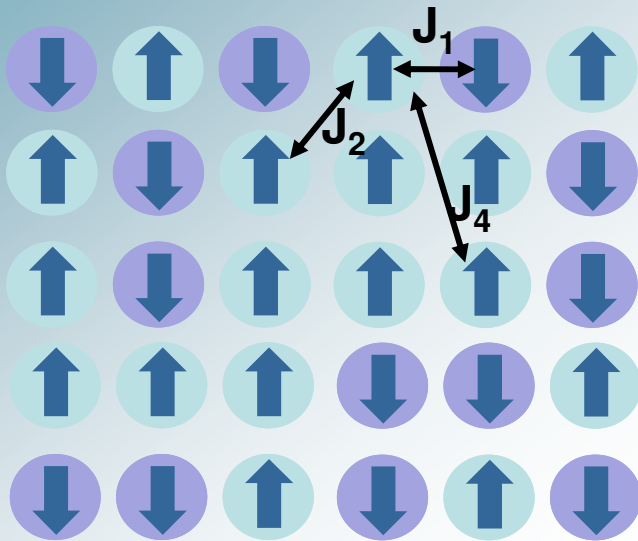
# Vibronic excitations in bcc iron



# Magnetic Excitations



$T > 0K$

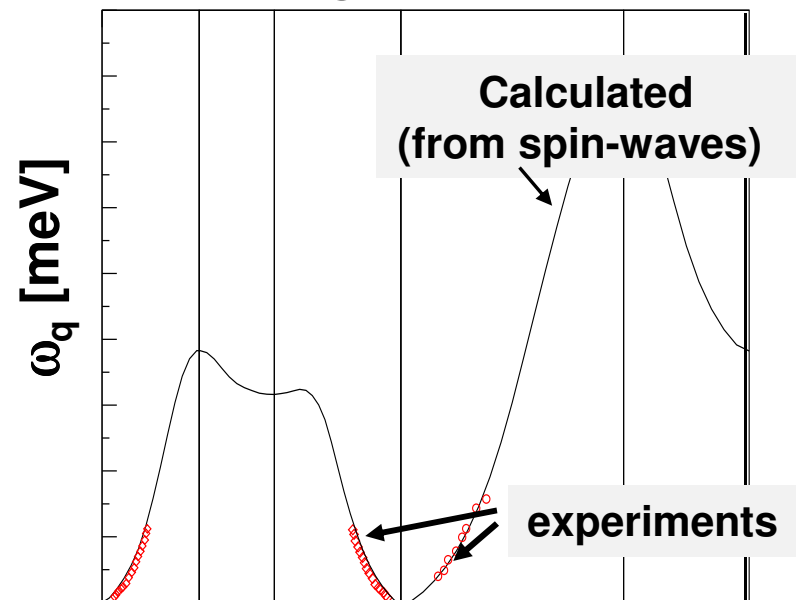


Construct spin Hamiltonian  
(e.g. Heisenberg model)

$$H = - \sum_{i,j} J_{i,j} \mathbf{S}_i \cdot \mathbf{S}_j$$

Typically 30 and more neighbors  
have to be included!

Magnons



Koermann, et al., PRB 78, 033102 (2008)

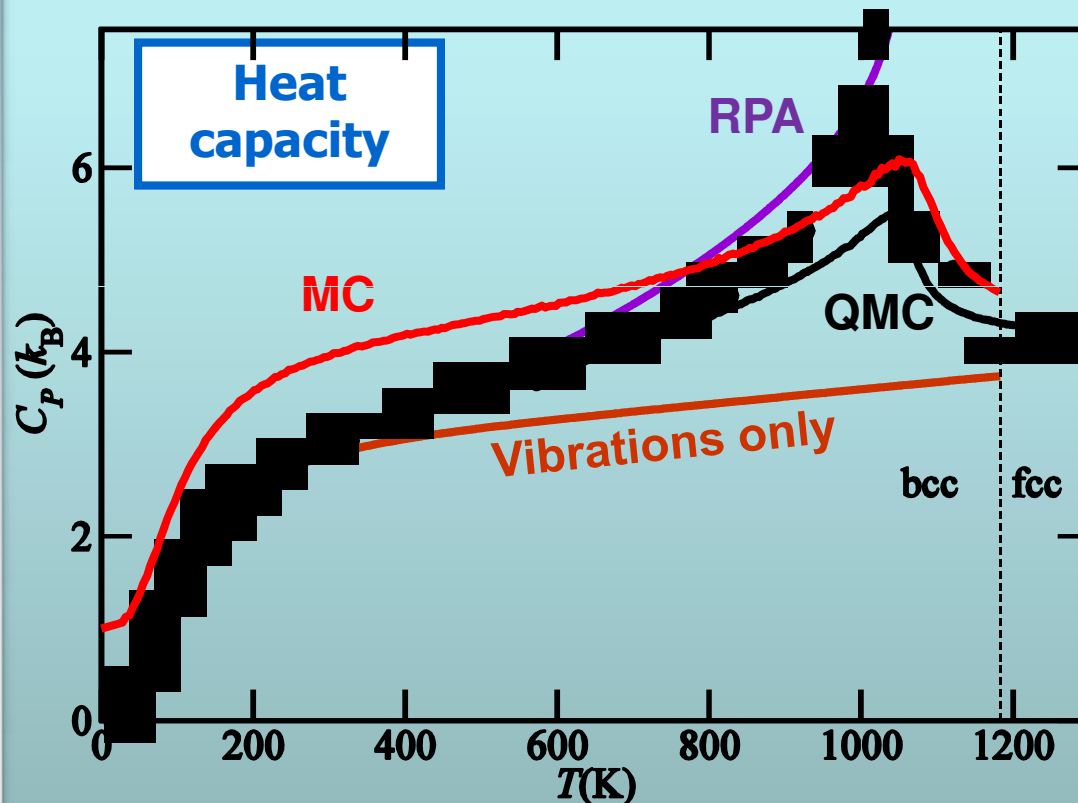
# Finite Temperature Magnetism



Construct and solve magnetic Hamiltonian:  $H^{mag} = -\sum_{i,j} J_{i,j} \mathbf{S}_i \cdot \mathbf{S}_j$

→ from DFT  
→ >30 neighbors

Example: Heat capacity of  $\alpha$  iron



Hierarchy of approaches:

- classical Monte-Carlo (**MC**):  
→ fails below  $T_C$
- analytical approach (**RPA**):  
→ only  $<T_C$
- quantum Monte-Carlo (**QMC**):  
→ map on eff.  $H^{mag}$   
→ works everywhere

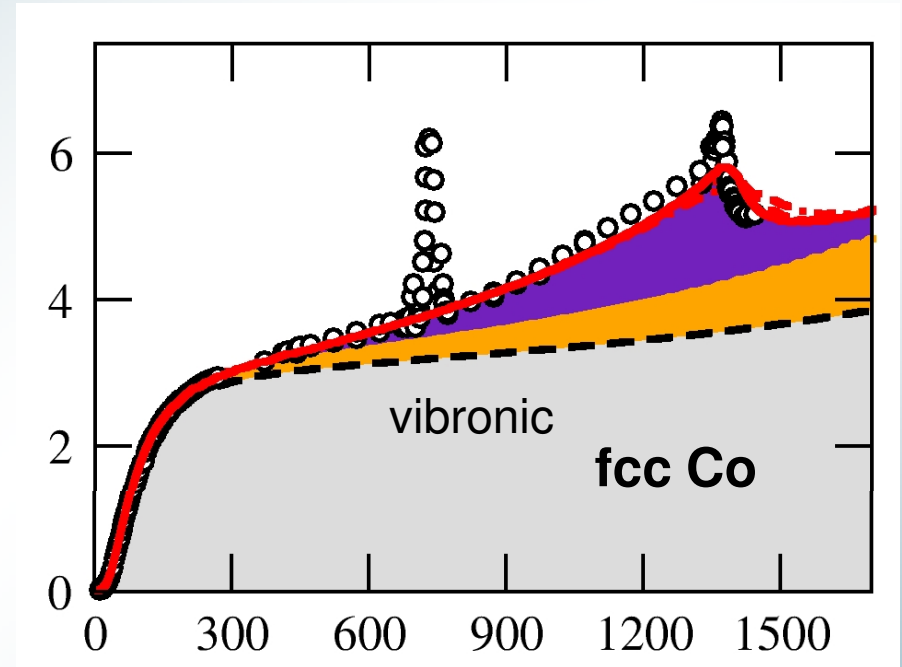
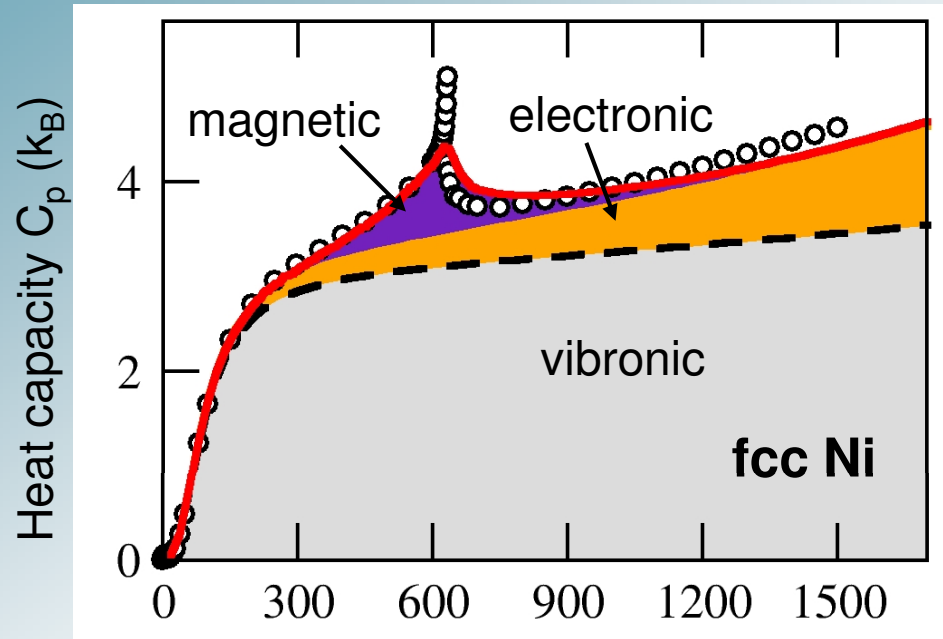
Koermann et al , PRB **78**, 033102 (2008);  
PRB **81**, 134425 (2010);  
PRB **83** (2011)



# Application to magnetic metals



## Specific heat

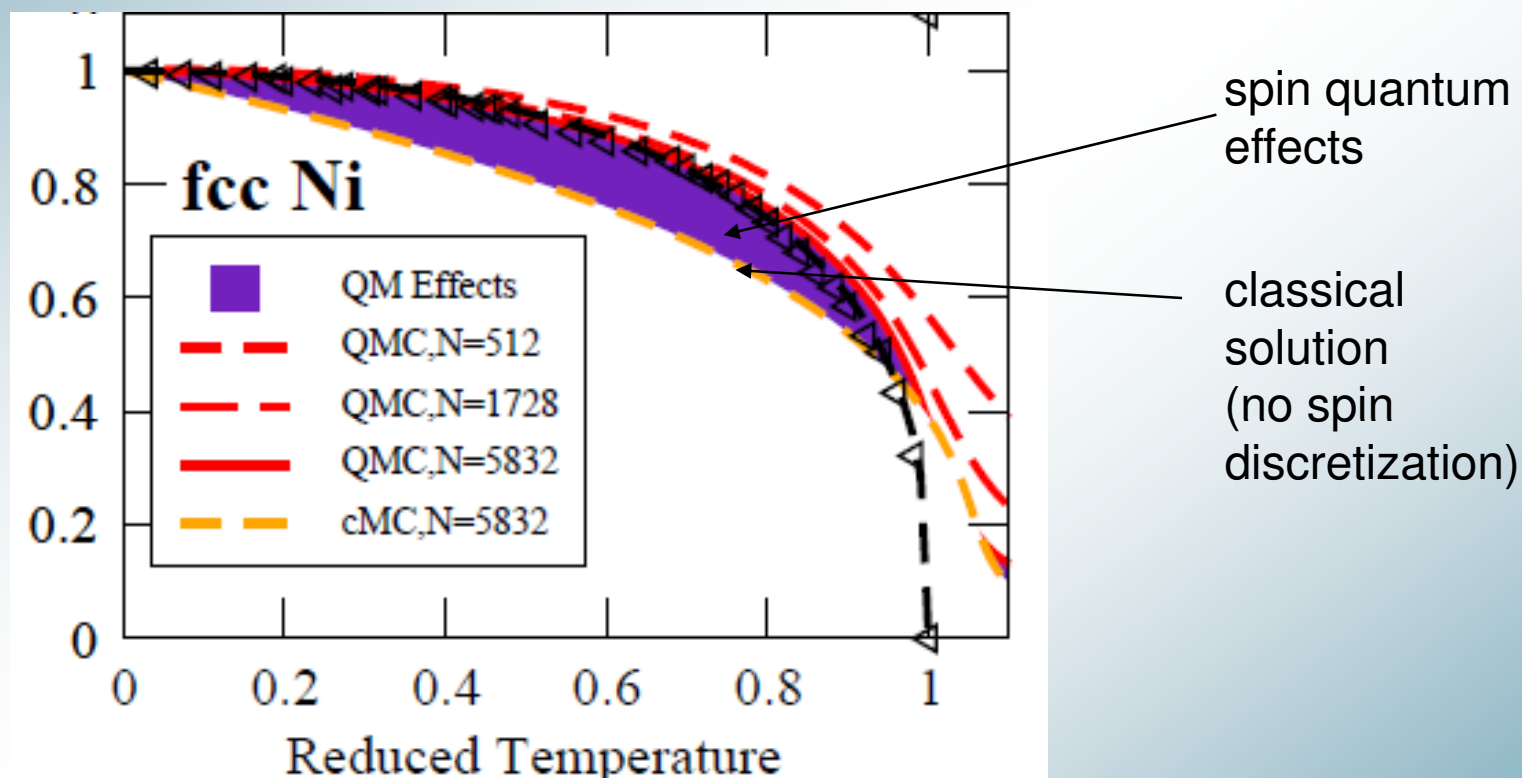


Free energy contributions well captured by PBE-DFT  
→ accurate description even of highly sensitive quantities such as  $c_p$

# Magnetization curves



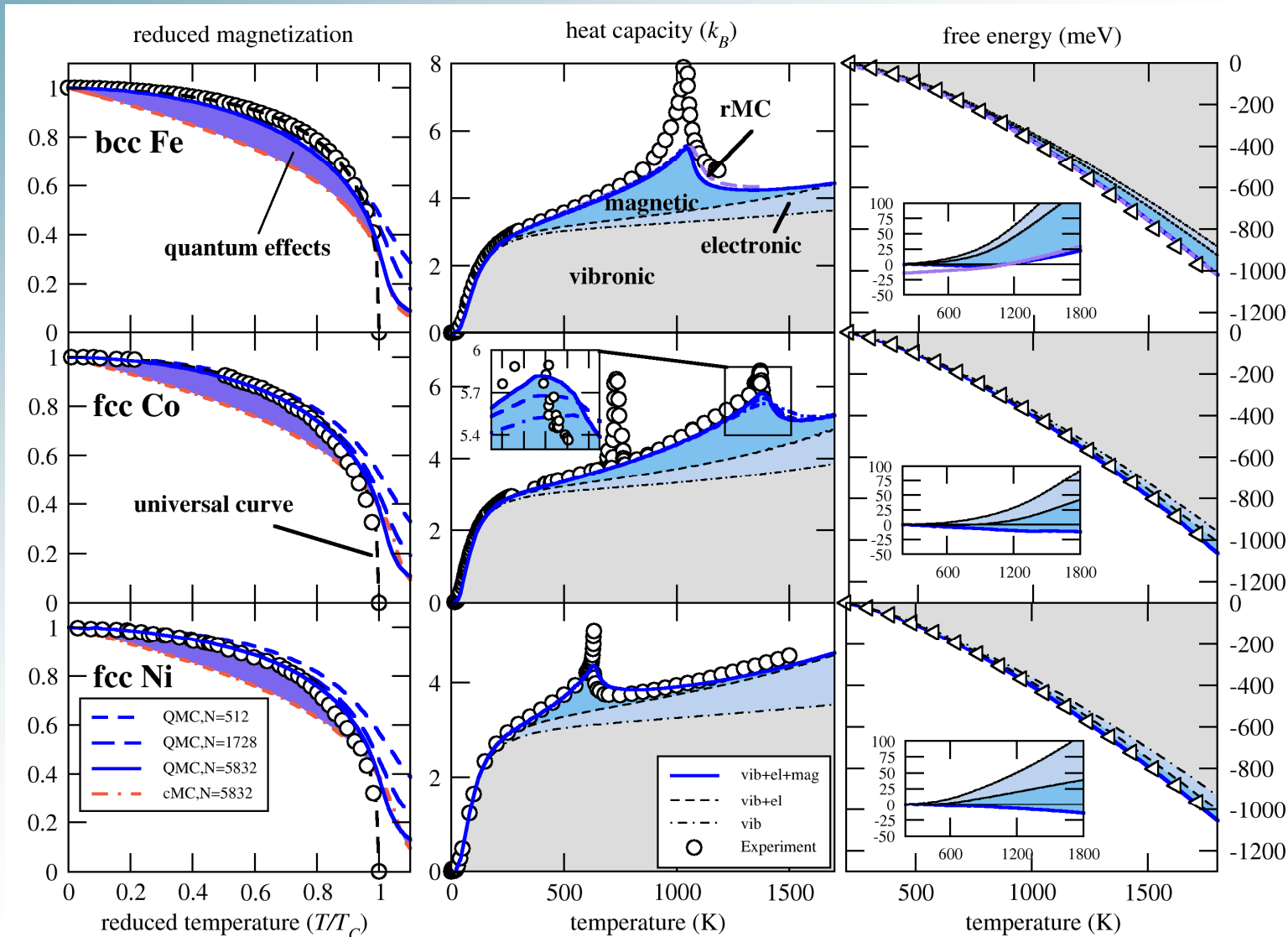
## Reduced magnetic moment of other transition metals



Spin QMC calculations of effective Heisenberg Hamiltonian allow ab initio description of magnetization curves of real materials (long range frustrated interactions)

→ Hitherto achievable only by empirical (fitted) relations

# Magnetization, heat capacity, free energies

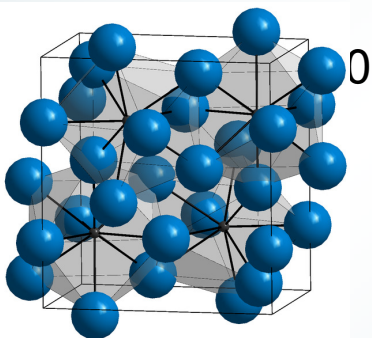
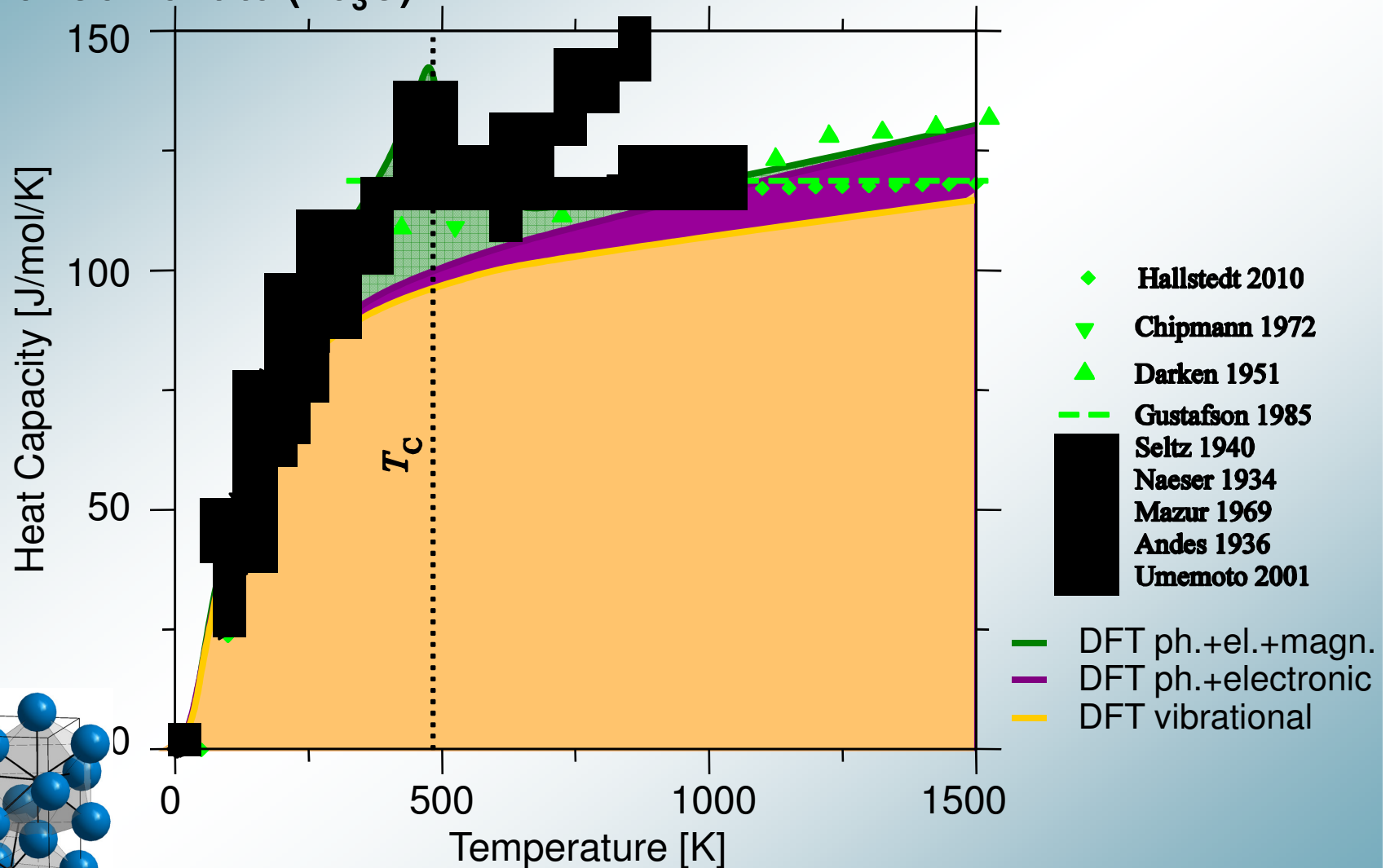


F. Körmann, A. Dick, T. Hickel, and J. Neugebauer, Phys. Rev. B 83, 165114 (2011)

# Heat capacity of alloys



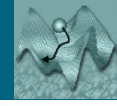
## Example: Cementite ( $\text{Fe}_3\text{C}$ )



■ G. Naeser, Mitt. Kais.-Wilh.-Inst. Eisenforsch. 16 (1934) 207210.



# Ab initio thermodynamics



Newly developed approaches allow to systematically improve performance of DFT to describe finite temperature properties

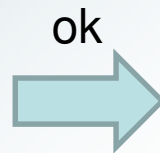
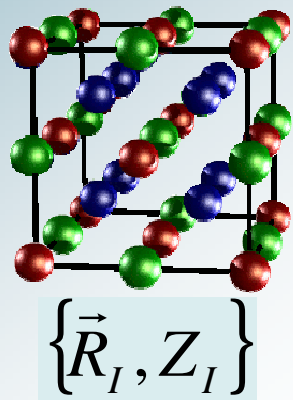
Accuracy often exceeds calorimetric experimental data

→ Provide excellent basis to compute thermodynamic data

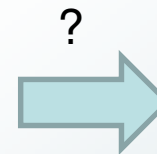
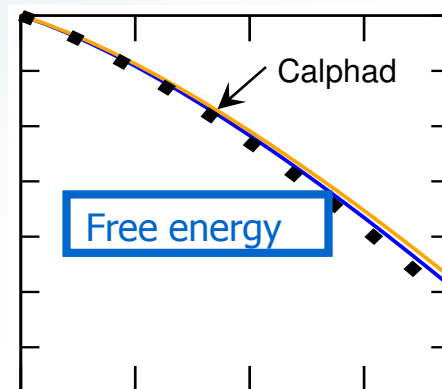




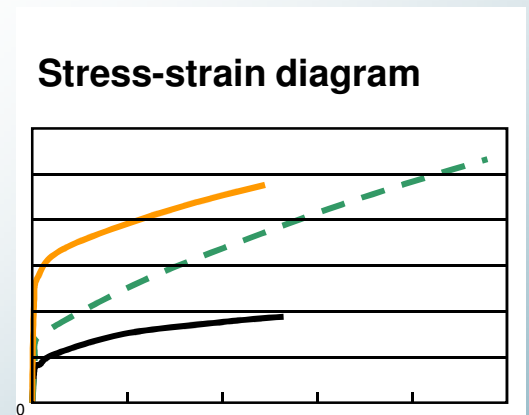
“Genome”

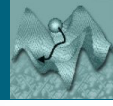


Ab initio thermodynamics



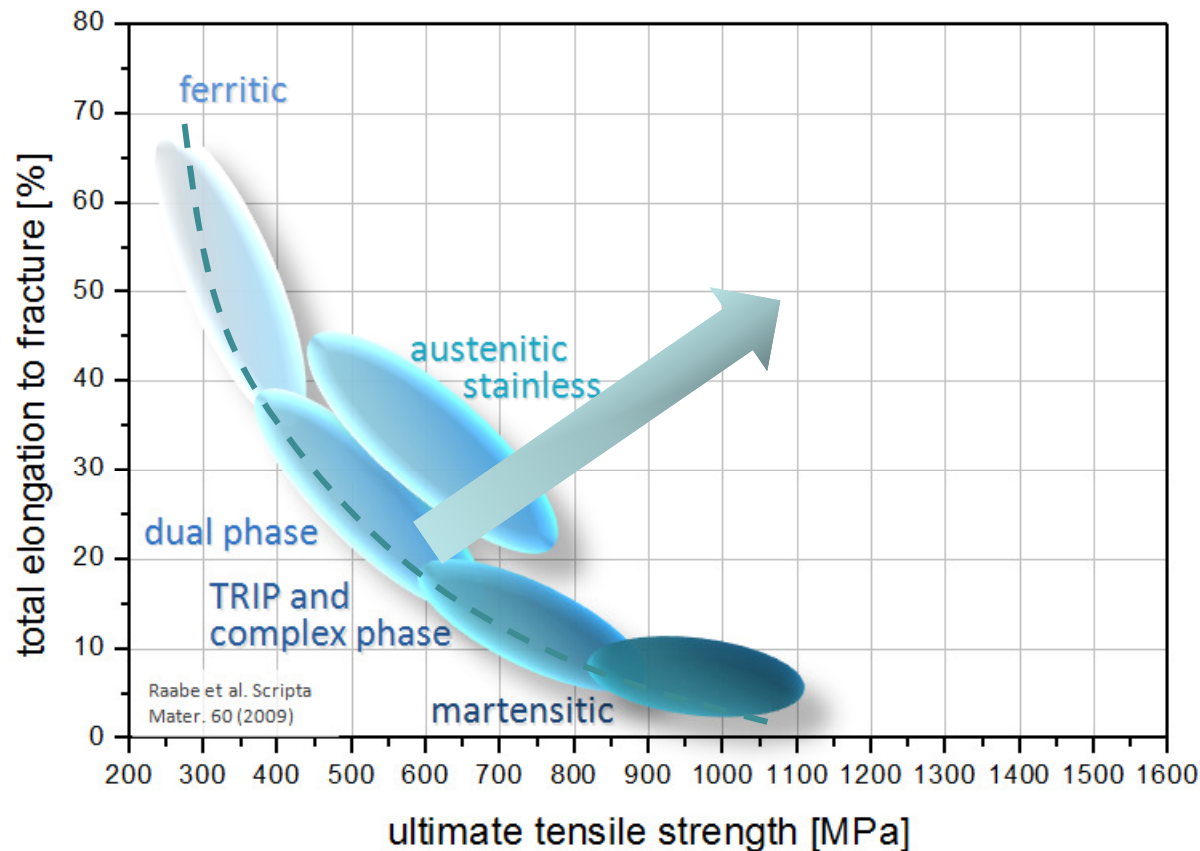
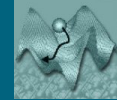
Engineering properties





## Designing high strength steels

# Why do we need new steel grades?



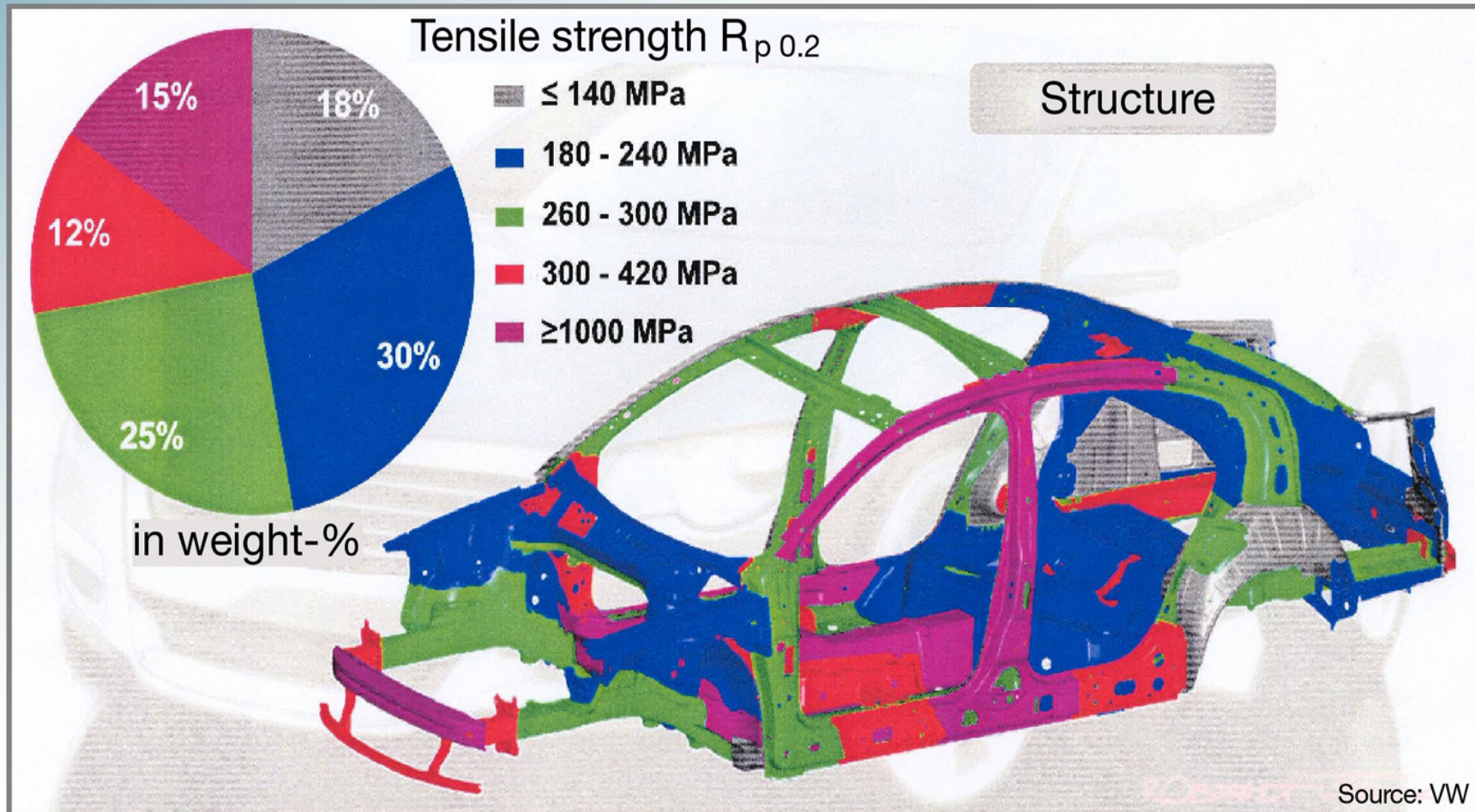
**Key challenge of structural materials design:**  
→ Inverse strength-ductility relation



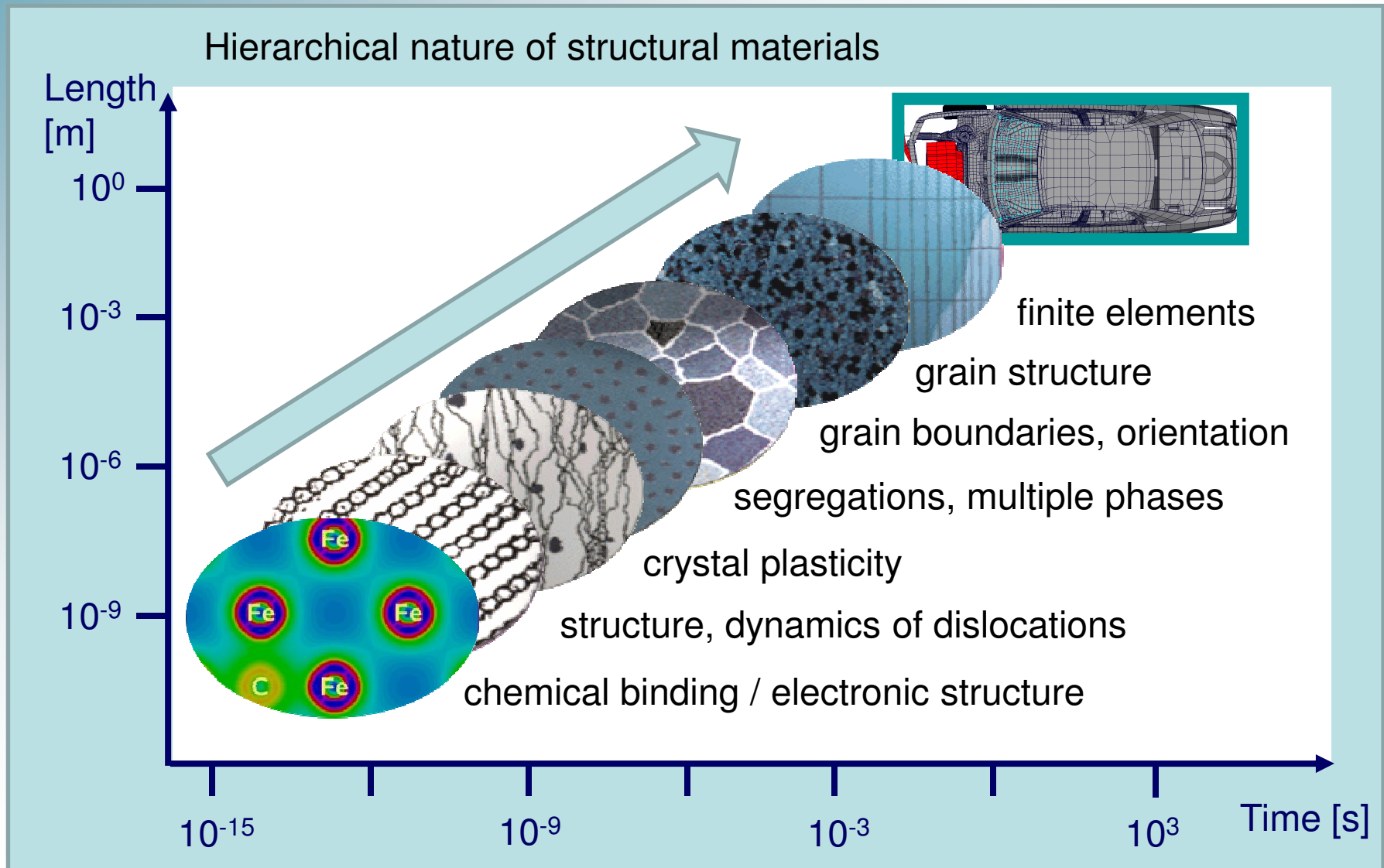
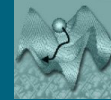
# Development of Novel Steels



## Steel Innovations in Cars: The New VW Passat is Leading Load optimised use of steel (grades)



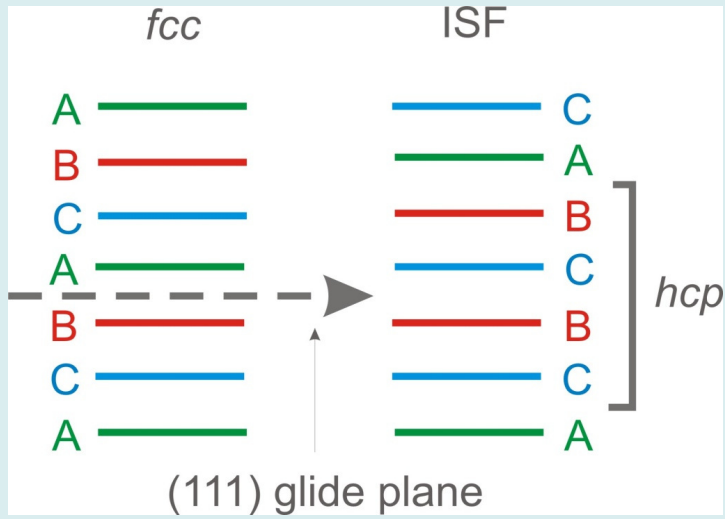
# Challenges



# Designing high-strength steels



## Stacking Fault Energy



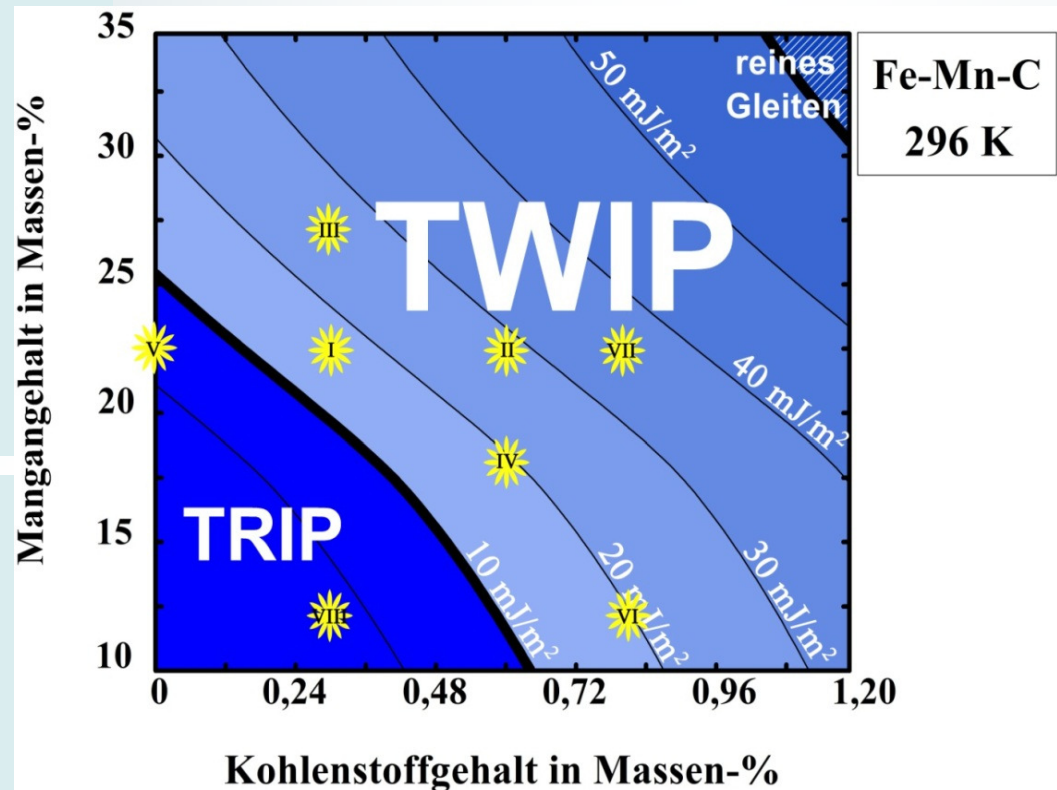
free energy difference fcc/hcp

$$\gamma = 2\rho\Delta G^{\gamma \rightarrow \varepsilon} + 2\sigma^{\gamma \rightarrow \varepsilon}$$

interface energy

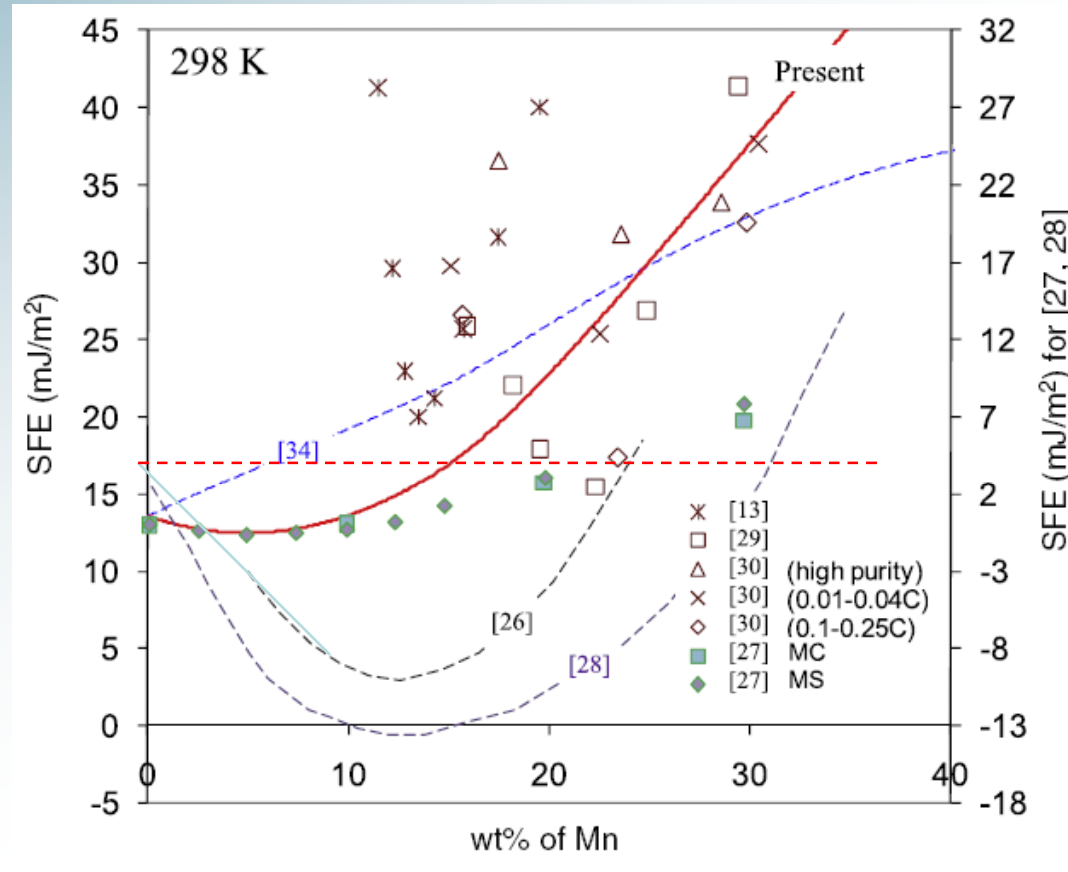
molar surface density

intrinsic SFE





## Stacking fault energies



Stacking fault energies are experimentally hard to assess  
 → not even qualitative trends can be derived

# Fully *ab initio* description of the SFE



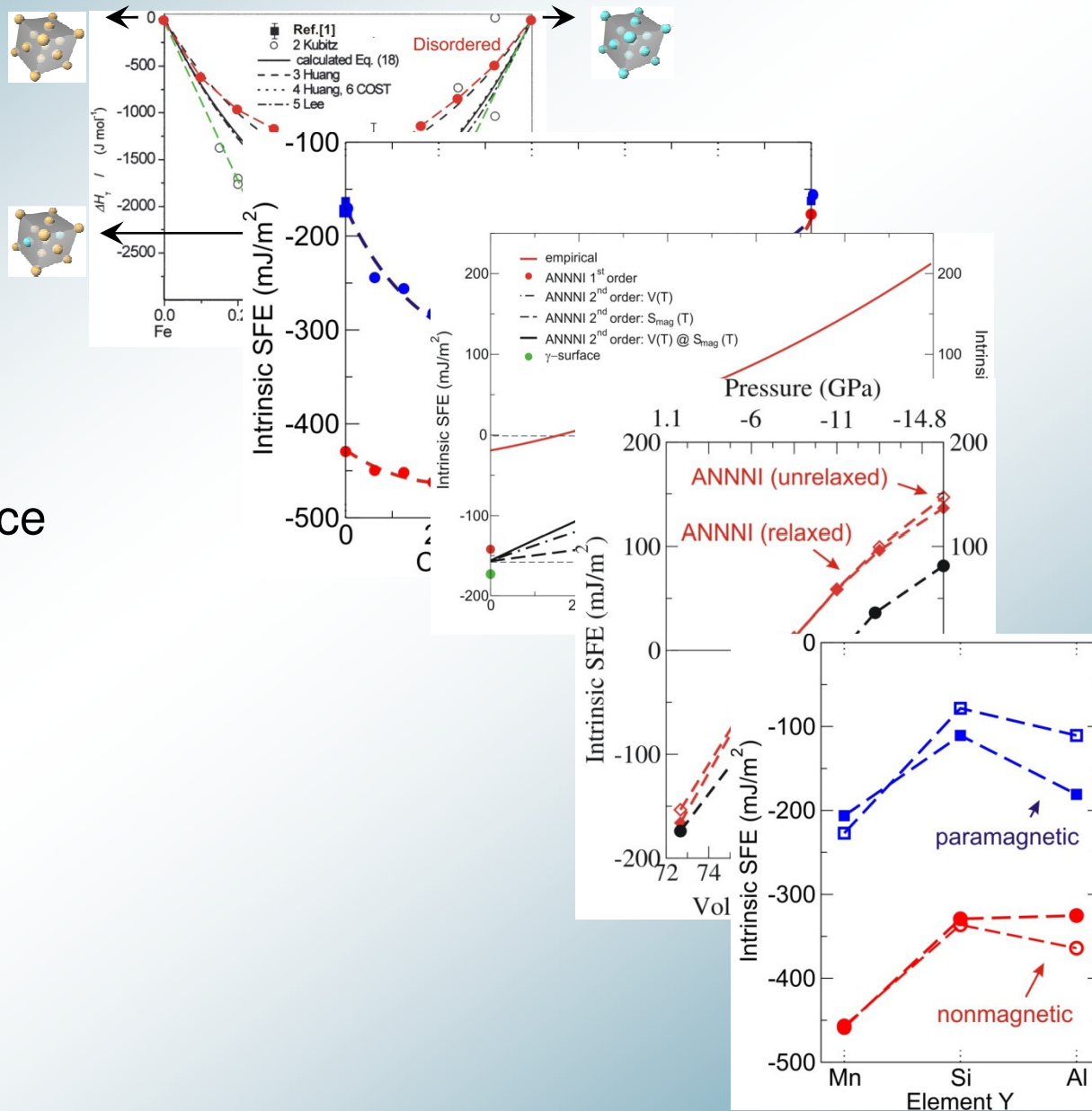
→ Atomic order/disorder

→ Magnetism

→ Temperature dependence

→ Volume/strain

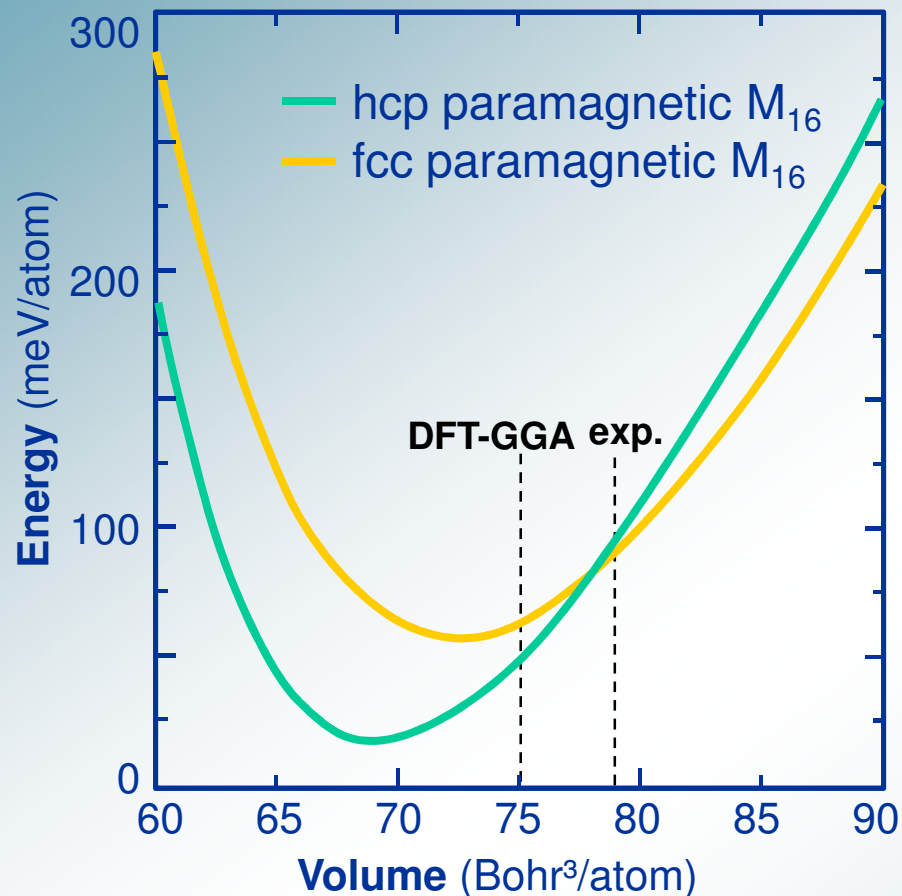
→ Chemical alloying



# Combination of DFT and CALPHAD



## Volume dependence for pure iron



### Ab initio approach:

$$\gamma = \frac{2\Delta G^{\gamma \rightarrow \varepsilon}}{\rho}$$

- Both phases at *same* volume
- No empirical parameters

### CALPHAD approach to SFE:

$$\gamma = \frac{2\Delta G^{\gamma \rightarrow \varepsilon}}{\rho} + 2\sigma^{\gamma \rightarrow \varepsilon}$$

- Both phases at *equilibrium* volume
- Unknown empirical parameter  $\sigma$

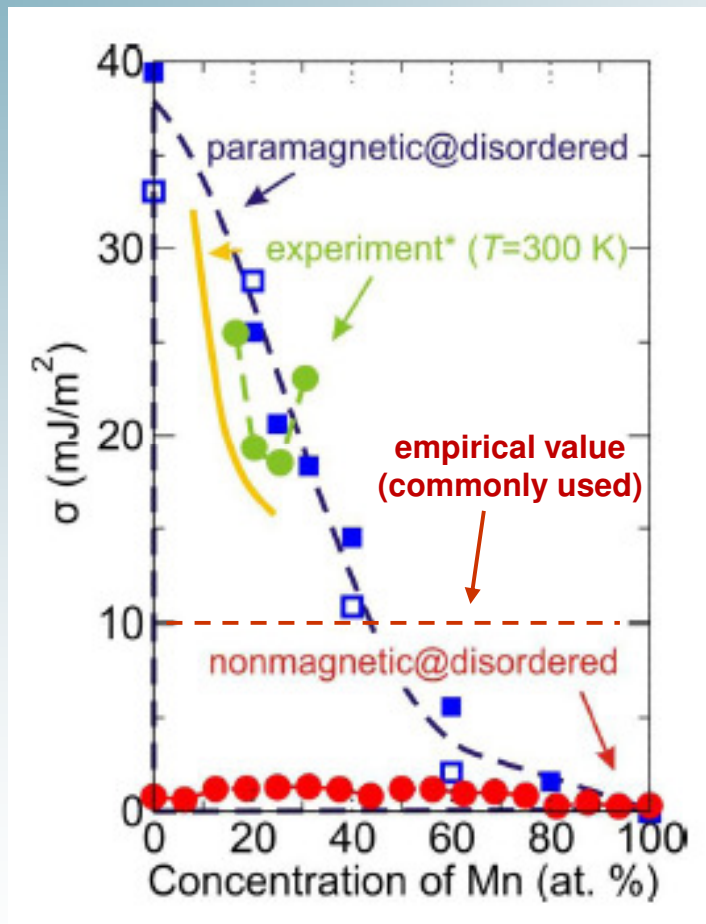
Combination:

$$\sigma^{\gamma \rightarrow \varepsilon} = \frac{\gamma}{2} - \frac{\Delta G^{\gamma \rightarrow \varepsilon}}{\rho}$$

# Ab initio determination of the SFE



## Determination of the interface energy $\sigma$



## Conventional approach:

$$\gamma = 2\rho\Delta G^{\gamma\rightarrow\epsilon} + 2\sigma^{\gamma\rightarrow\epsilon}$$

↑ interface energy  
→ fitting parameter

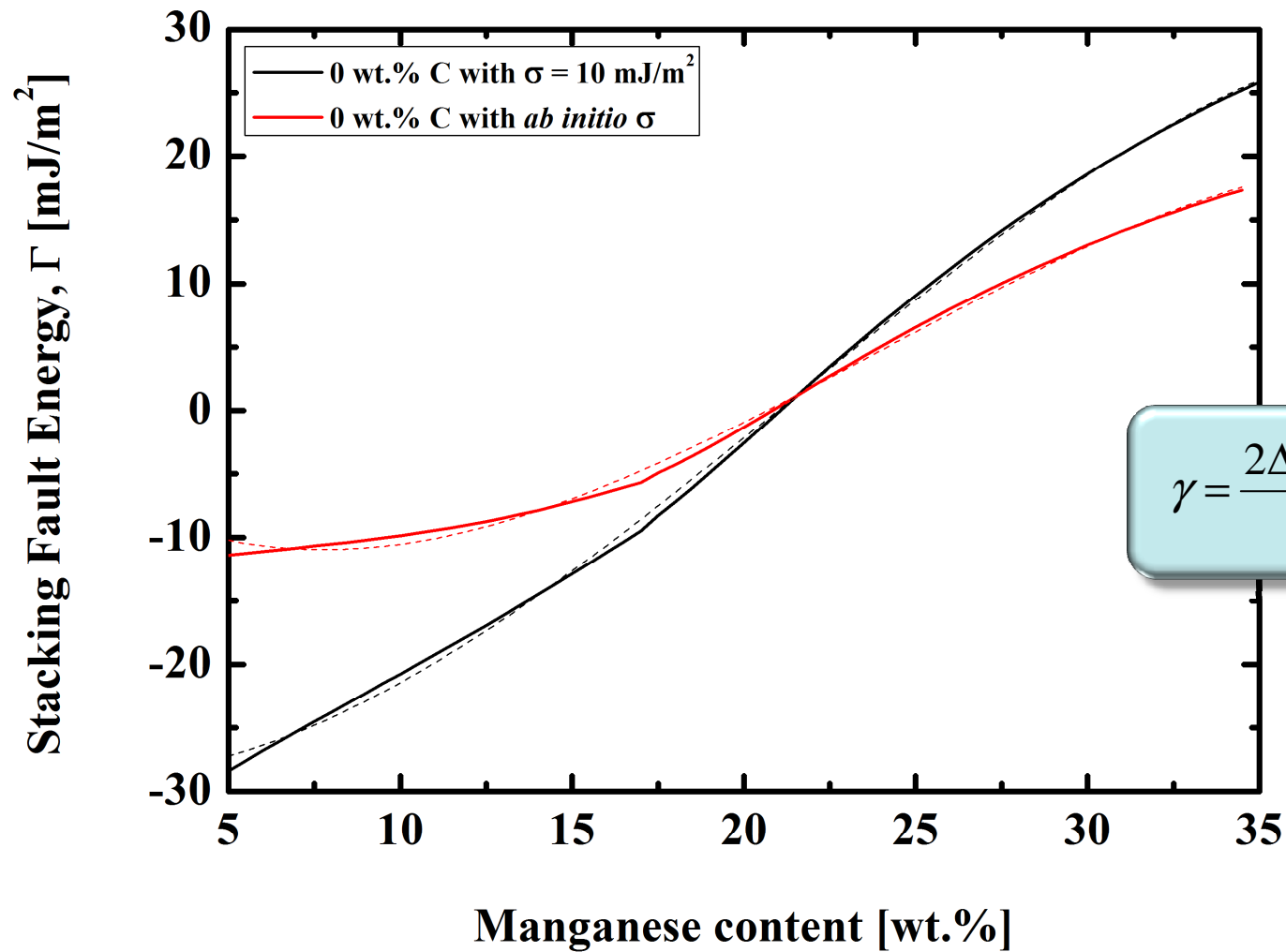
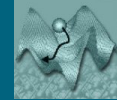
CALPHAD

↑ molar surface density

## Ab initio determination

- allows assessment of exp. data
- provides insight into relevant mechanisms
- determination of other dependencies, e.g., temperature, pressure, impurities

# Consequences for SFE

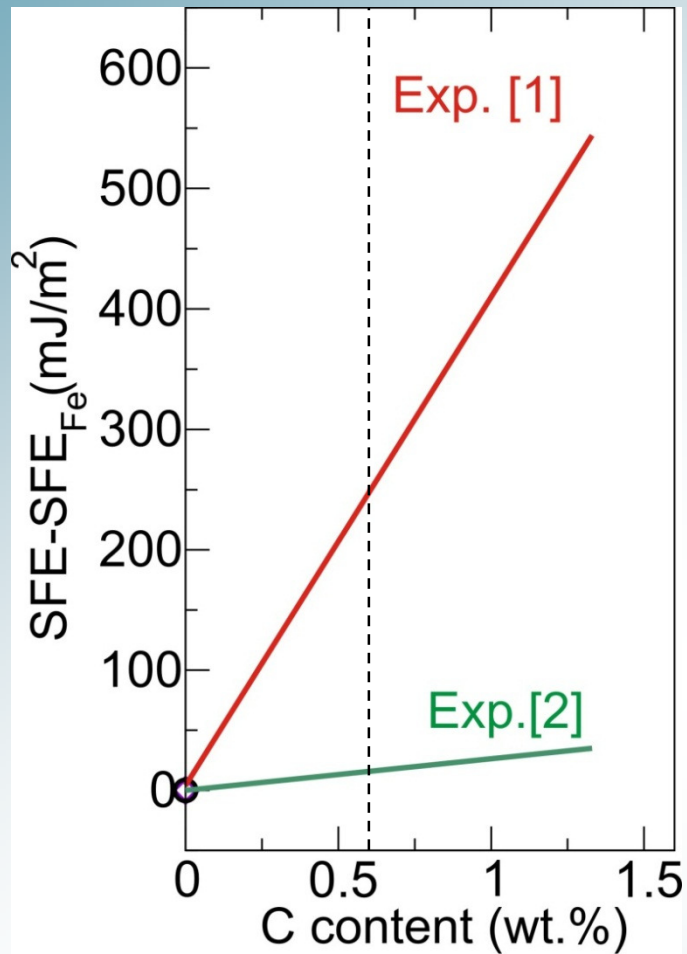


Alireza Saeed-Akbari (RWTH Aachen IEHK)





# Effect of C on the SFE

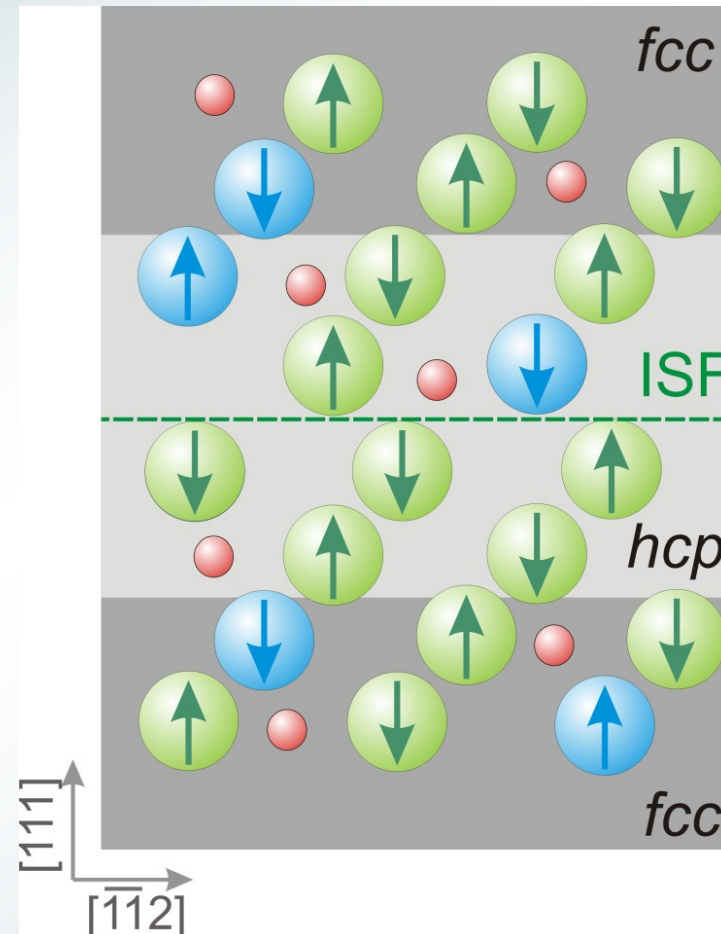
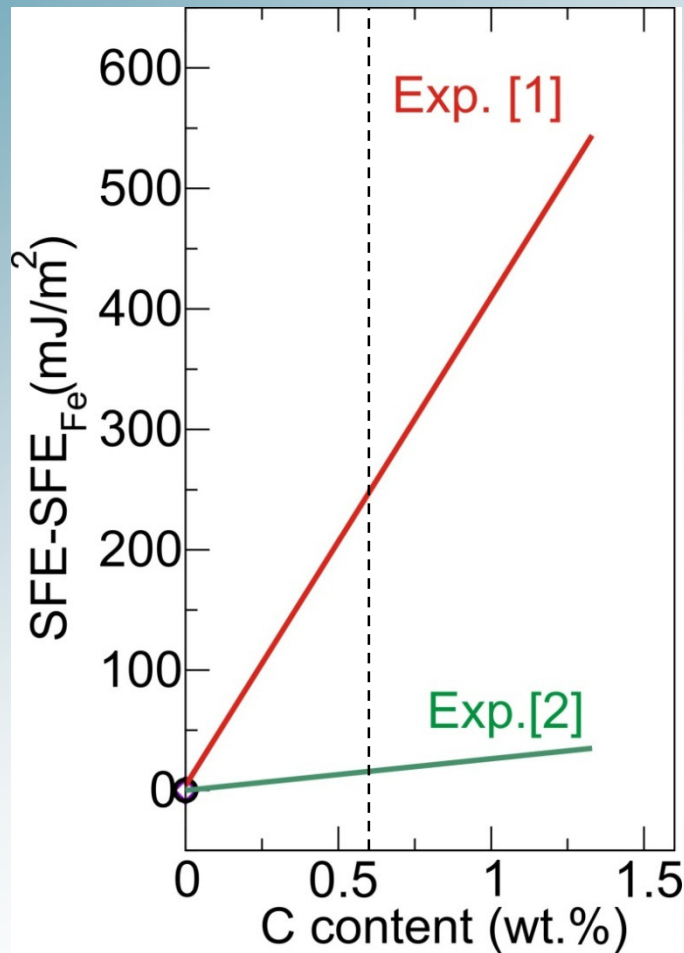


- Discrepancy between experiments

[1] R.E. Schramm and R.P. Reed, Metall. Mater. Trans. A **6**, 1345 (1975)

[2] P.J. Brofman and G.S. Ansell, Metall. Trans. A **9**, 879 (1978)

# Effect of C on the SFE

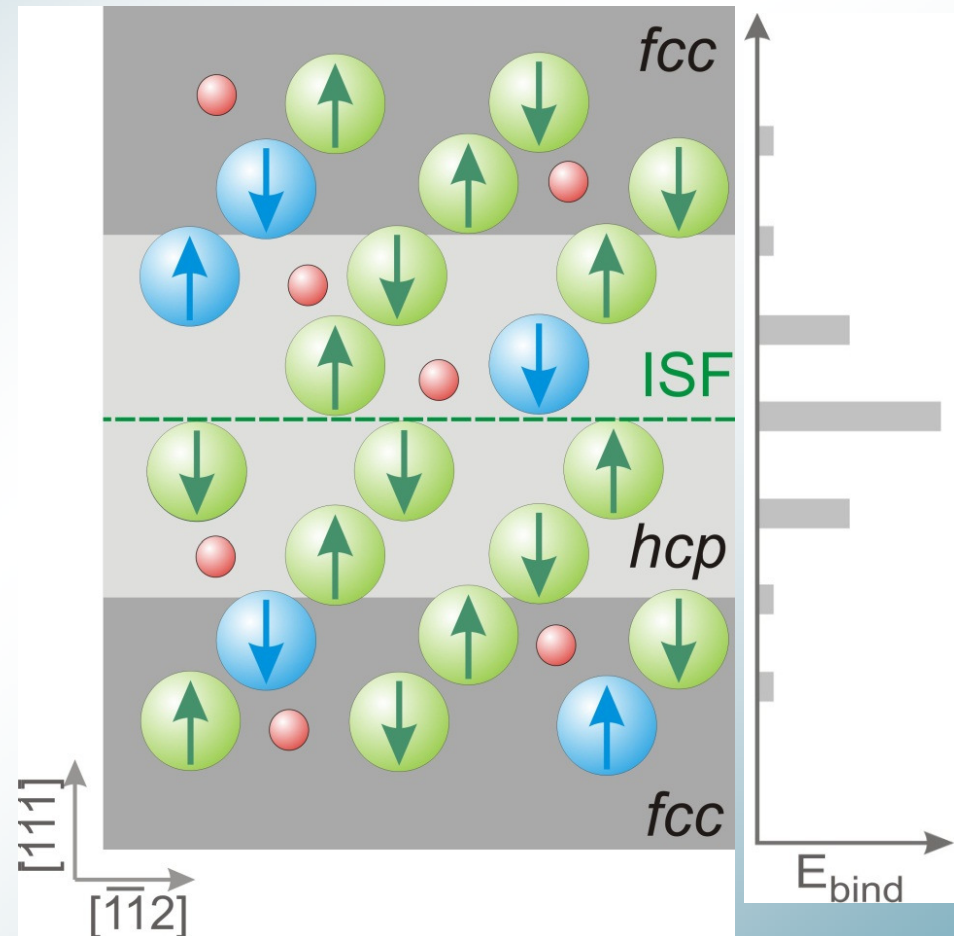
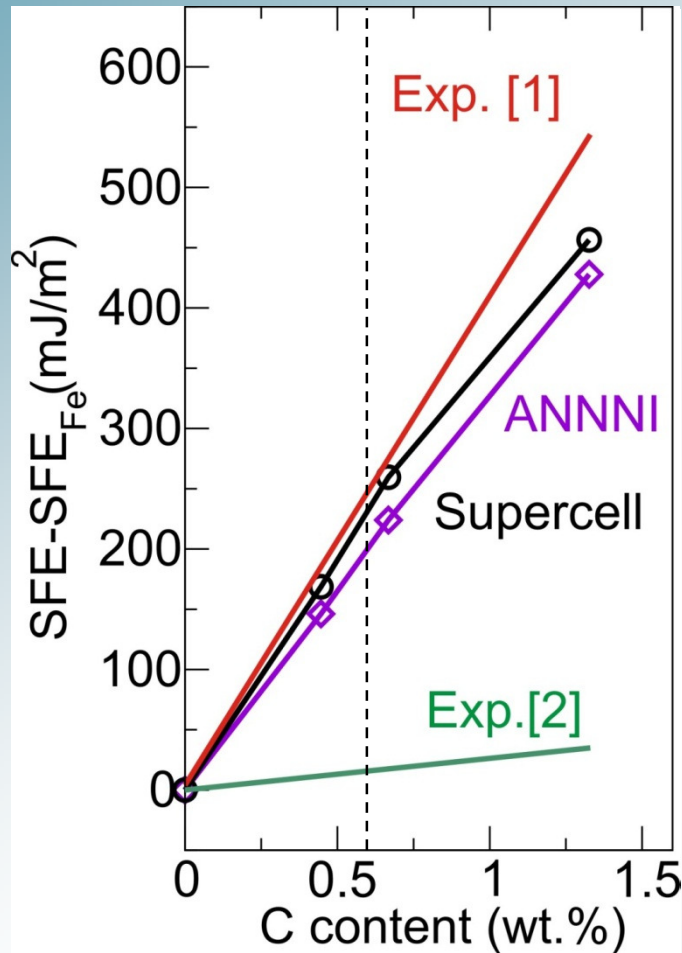


- Discrepancy between experiments
- Simulate different scenario

[1] R.E. Schramm and R.P. Reed, Metall. Mater. Trans. A **6**, 1345 (1975)

[2] P.J. Brofman and G.S. Ansell, Metall. Trans. A **9**, 879 (1978)

# Effect of C on the SFE

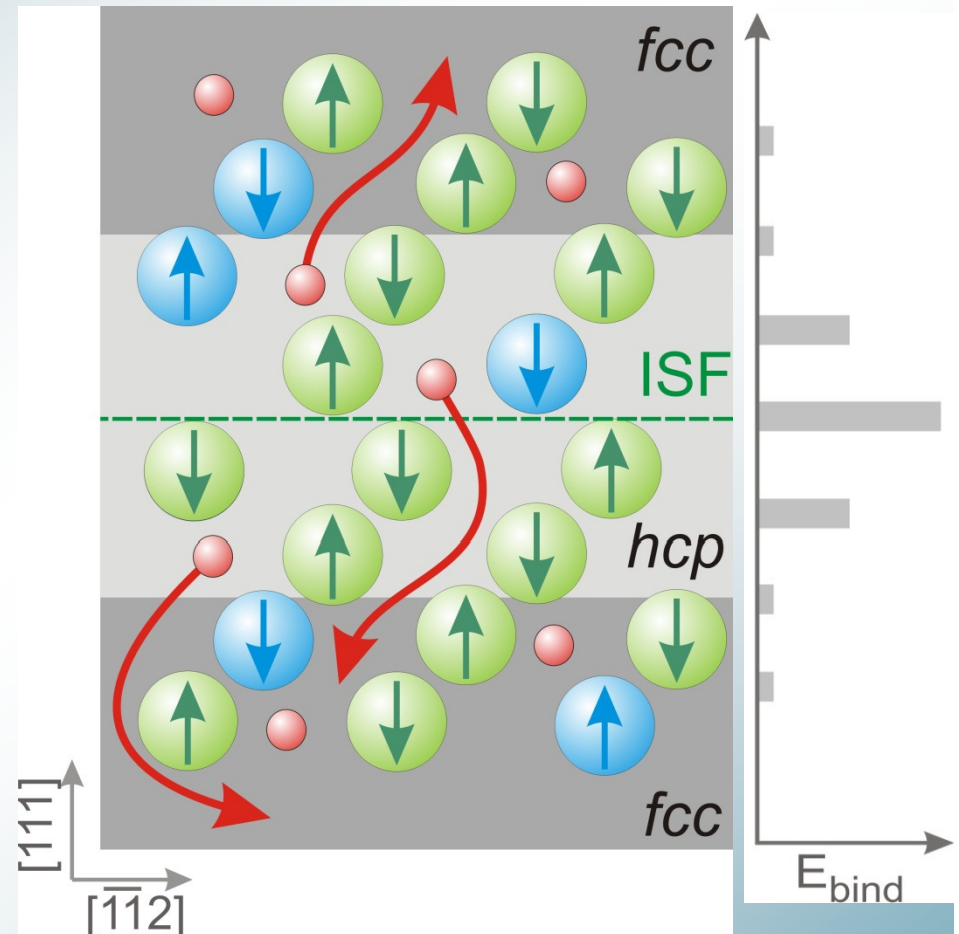
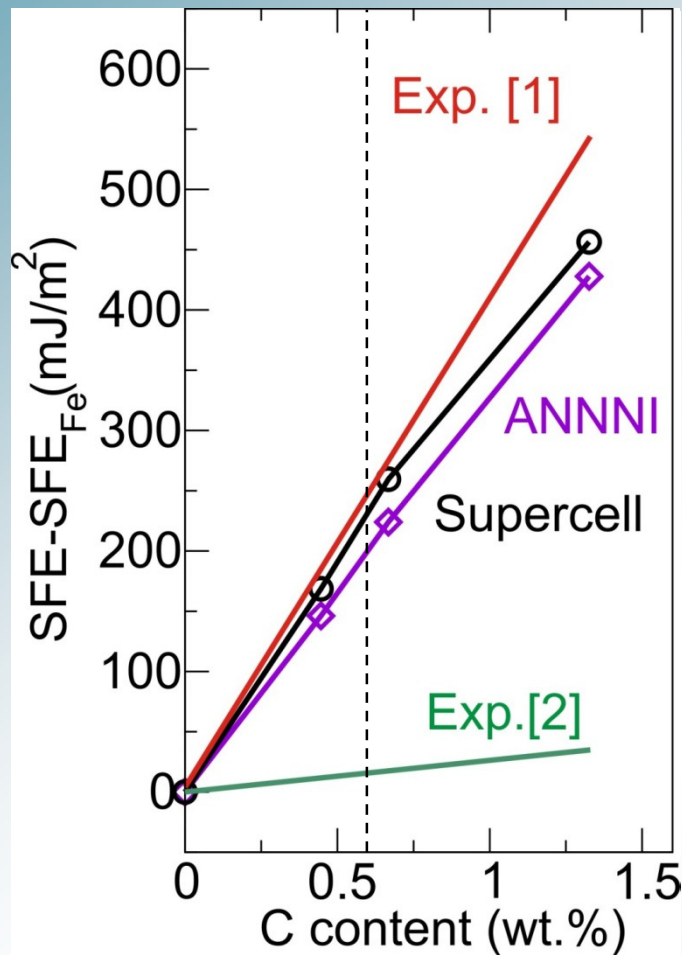


- Case one – homogeneous distribution of C-atoms
- Reproduce Exp.[1] (XRD-experiments)

[1] R.E. Schramm and R.P. Reed, Metall. Mater. Trans. A **6**, 1345 (1975)

[2] P.J. Brofman and G.S. Ansell, Metall. Trans. A **9**, 879 (1978)

# Effect of C on the SFE



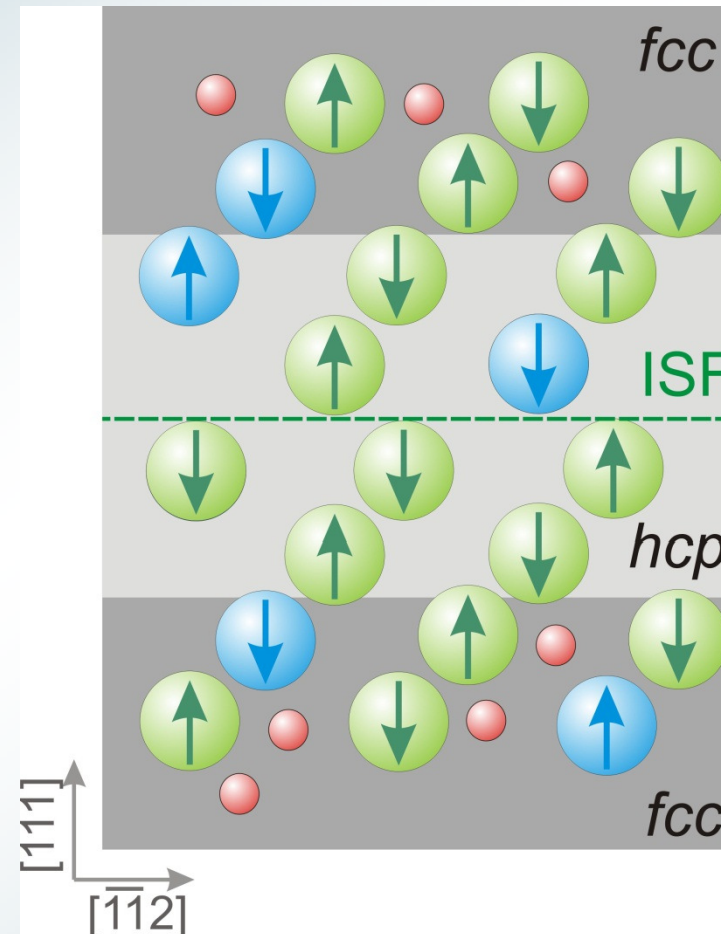
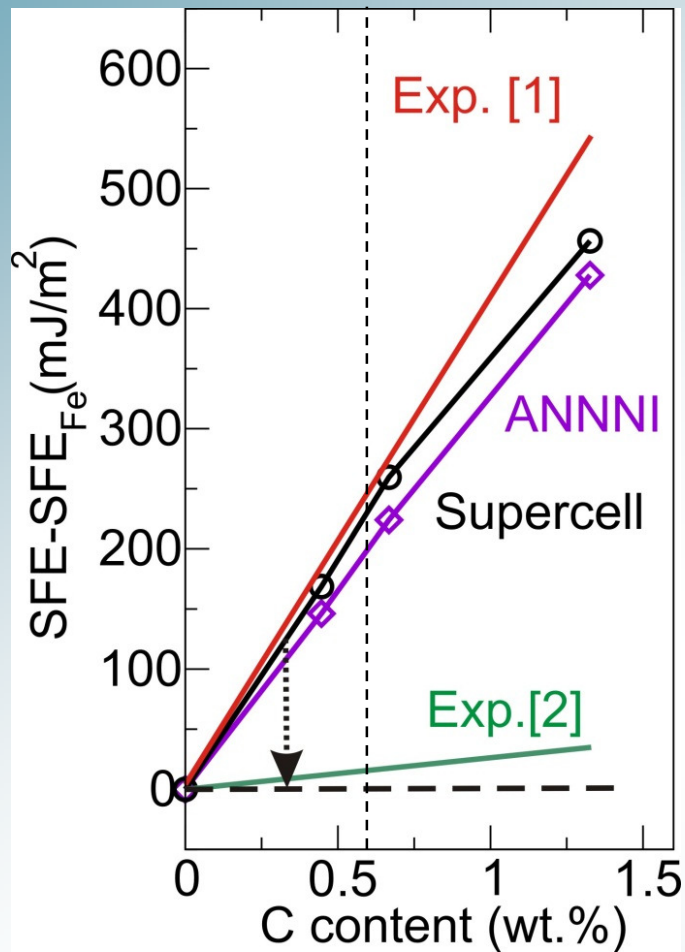
- Case one – homogeneous distribution of C-atoms
- Reproduce Exp.[1] (XRD-experiments)

A. Abbasi, A. Dick, T. Hickel, and J. Neugebauer, *Acta Mat.*, (2011) accepted

[1] R.E. Schramm and R.P. Reed, *Metall. Mater. Trans. A* **6**, 1345 (1975)

[2] P.J. Brofman and G.S. Ansell, *Metall. Trans. A* **9**, 879 (1978)

# Effect of C on the SFE



- Case two – defect region is depleted of C-atoms
- Close to Exp.[2] (TEM-experiments)

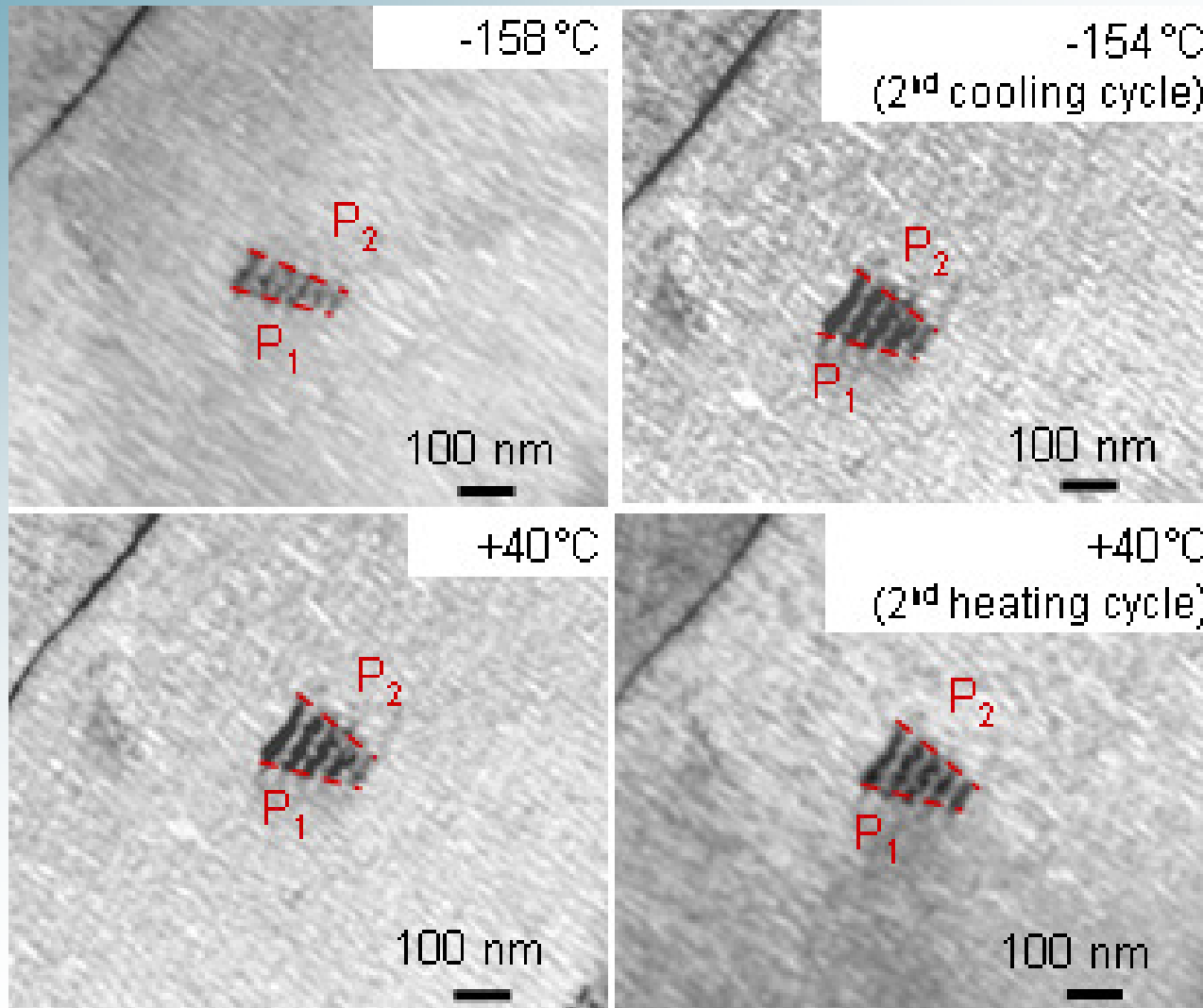
[1] R.E. Schramm and R.P. Reed, Metall. Mater. Trans. A **6**, 1345 (1975)

[2] P.J. Brofman and G.S. Ansell, Metall. Trans. A **9**, 879 (1978)

# Experimental validation: SFE measurements



Verification by TEM (S. Sandlöbes and D. Raabe):



Sample:

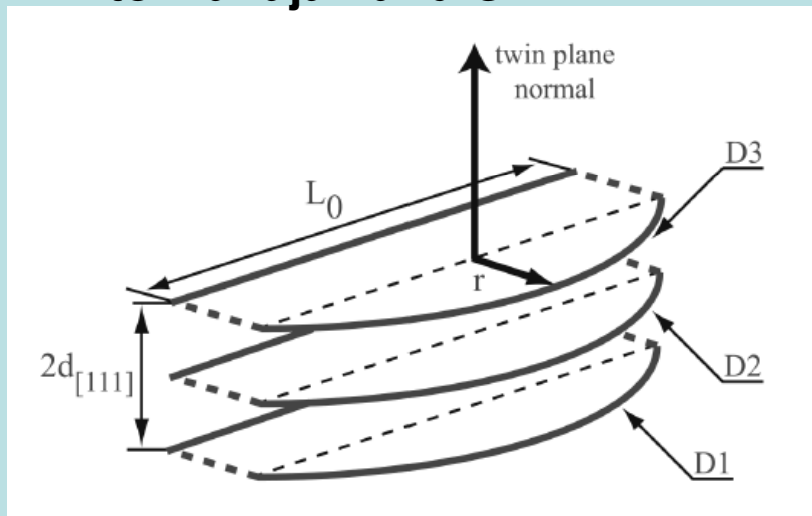
Fe-22Mn-0.6C

# From ab initio SFEs to hardening curves



## Constitutive model [1]:

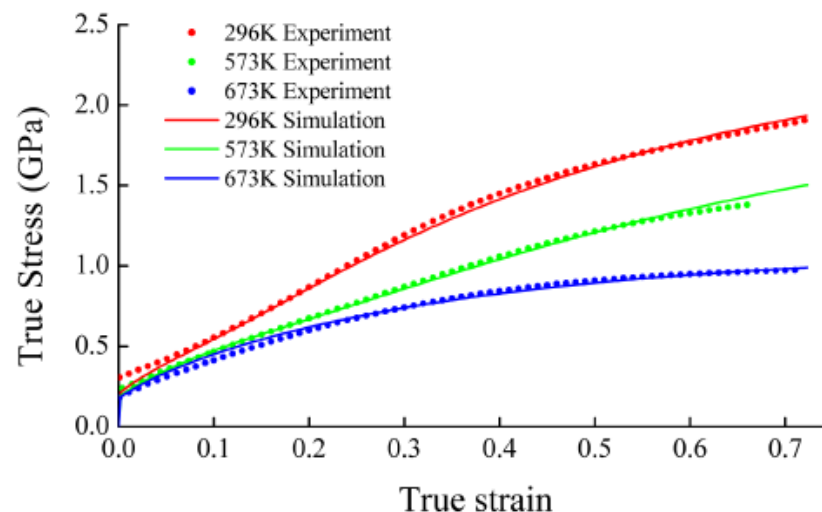
- twin volume and three kinds of vacancies used as state variables
- Twin-nucleation model according to Mahajan and Chin



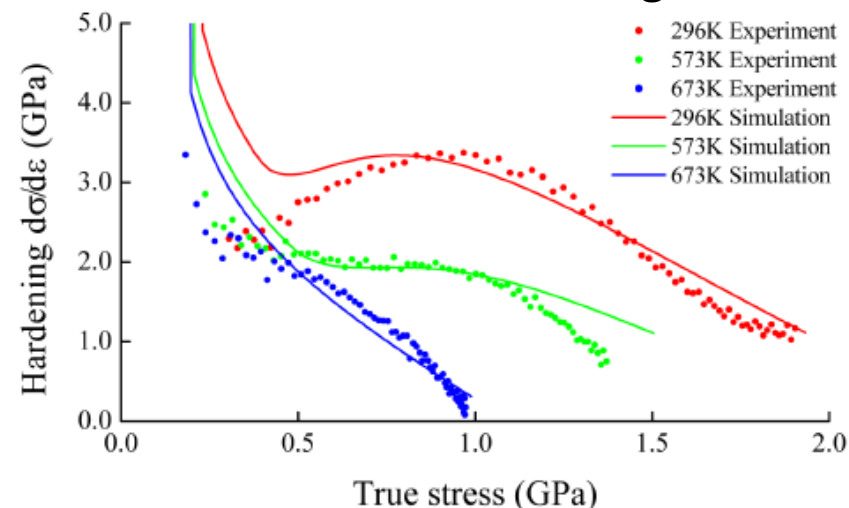
- Critical twinning stress

$$\tau_{tw} = \frac{\gamma}{3b_s} + \frac{3Gb_s}{L_0}$$

## stress-strain curve



## strain-hardening

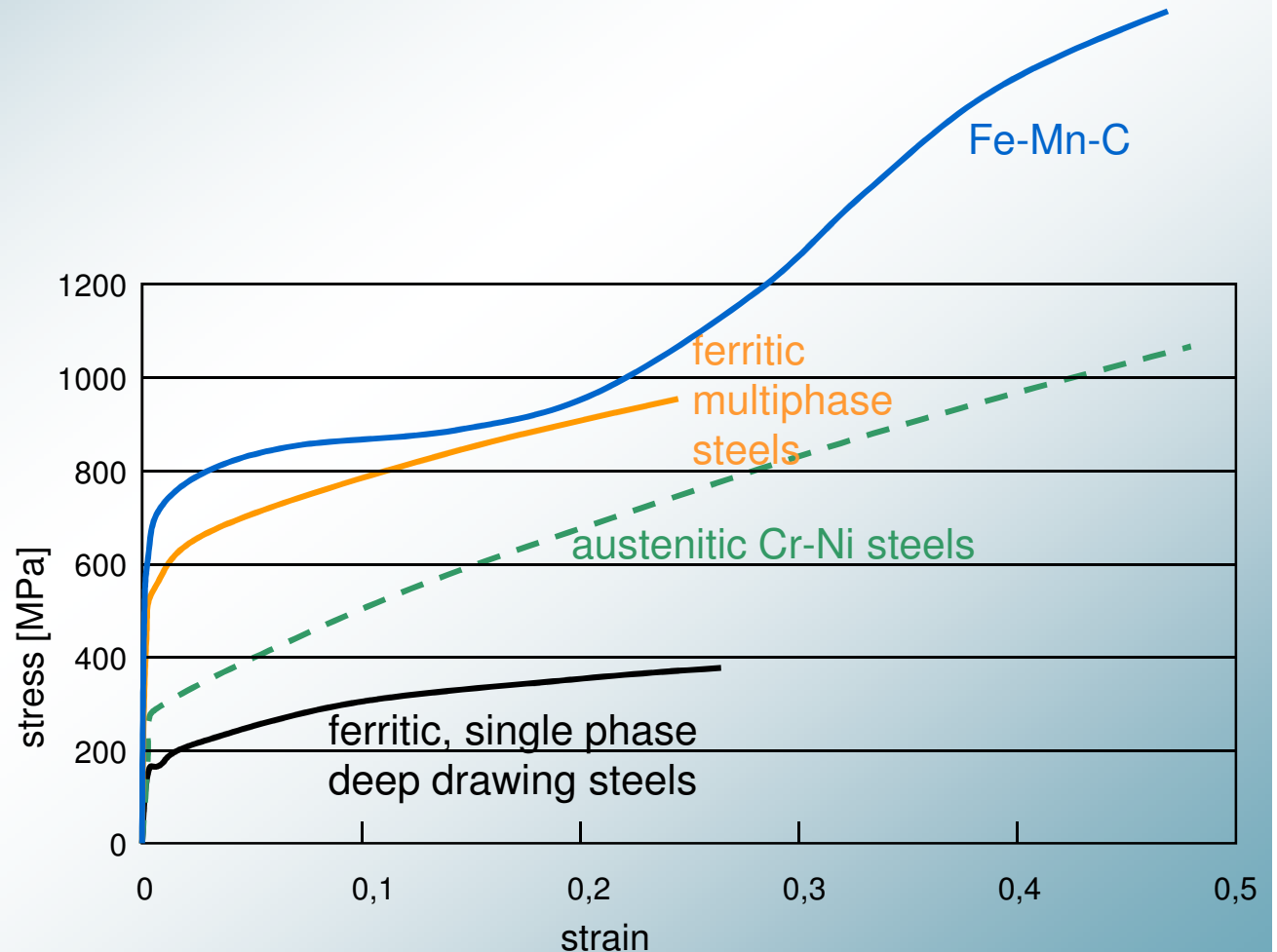
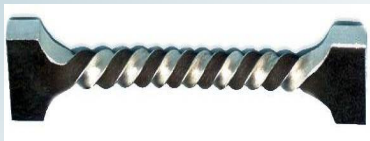


[1] Steinmetz, Roters, Raabe, et. al. 2011

# Application of these concepts



Development of a new generation of high-strength steels:



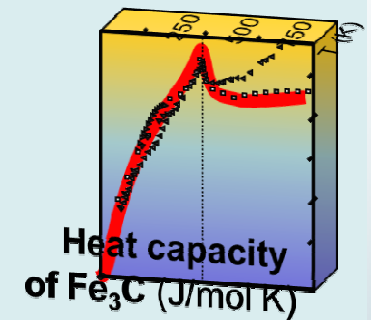


# Conclusions

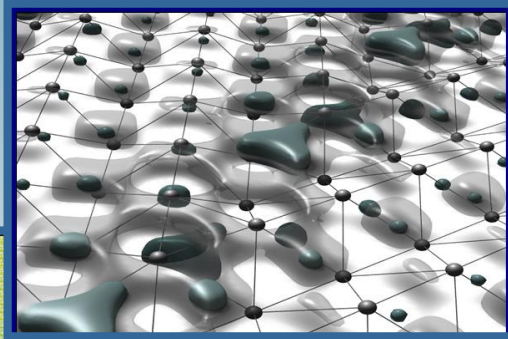


**Modern ab initio calculations are no longer restricted to  $T=0\text{K}$  and ground states**

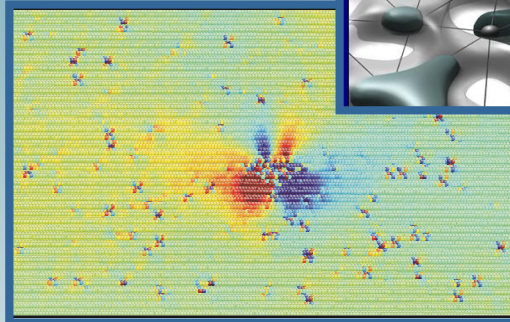
- **Newly developed approaches allow accurate computation of excitation mechanisms, free energies, heat capacities, phase transitions**
- **DFT calorimetric data often provide accuracy that is higher than exp.**
- **provide important first step to relate fully ab initio the materials genome to macroscopic properties**



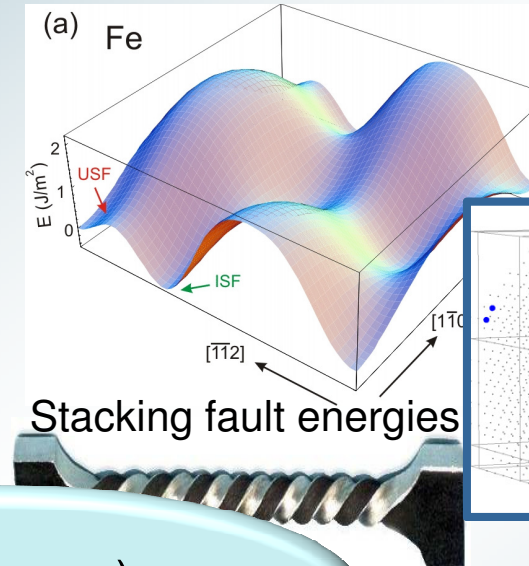
# Conclusions



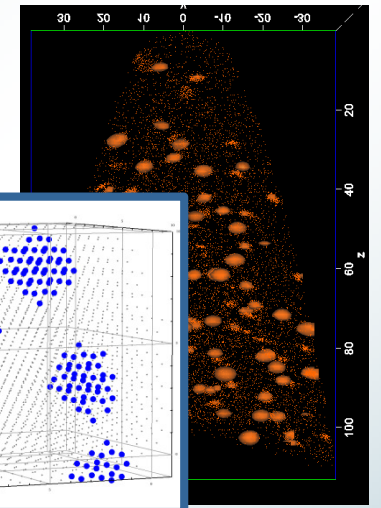
Hydrogen in GBs



Hydrogen embrittlement

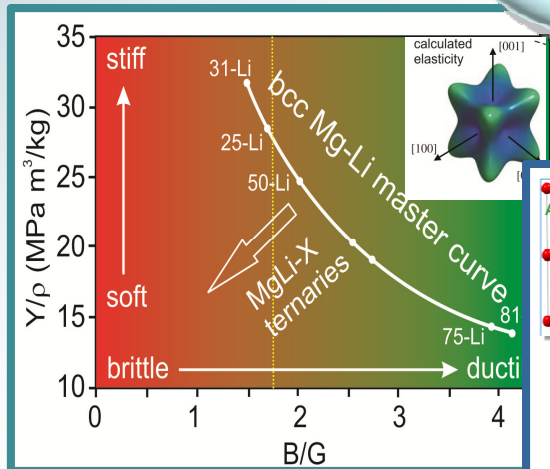


Stacking fault energies

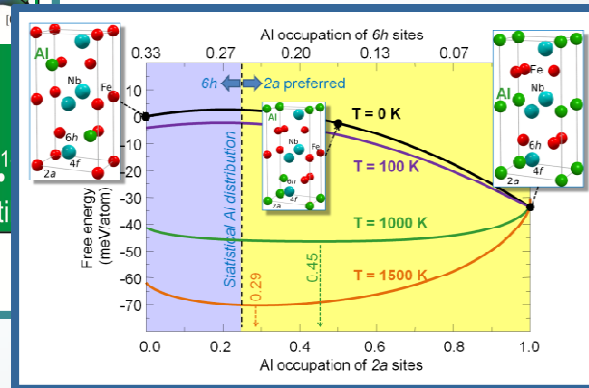


Precipitation kinetics

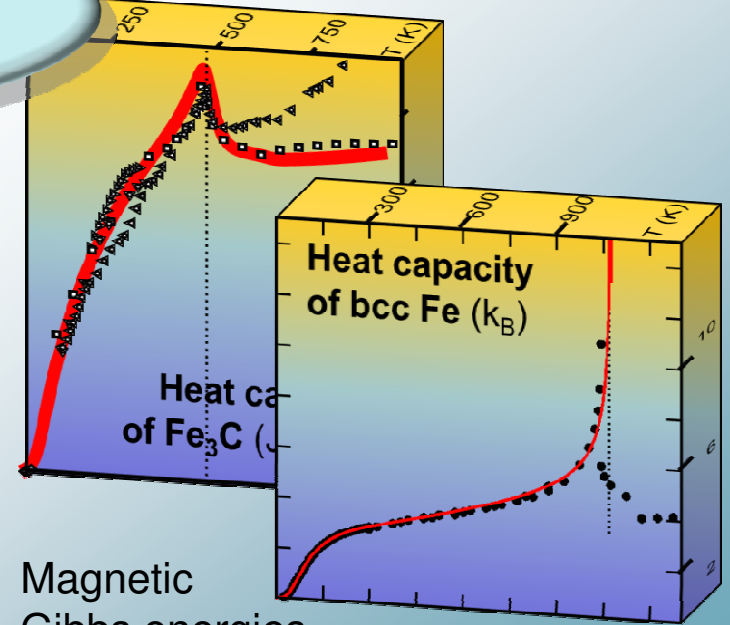
$F(V, T, c_\alpha, \dots)$



Alloy design

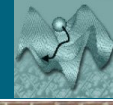


High-temperature steels



Magnetic Gibbs energies

# Thanks to the department



CM Department (2011)



MPIE, Dept. Computational Materials Design

Harnessing the Materials Genome, Vail, USA, Oct. 1-5, 2012



**Thanks for your attention**