

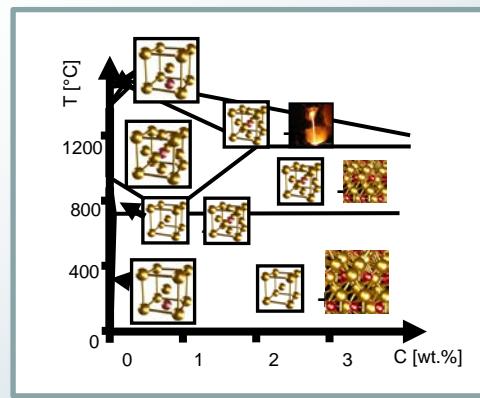
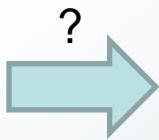
Long time scale simulations to determine accurate ab initio free energies

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$$Z = \sum_{\{\vec{R}_I\}} e^{-E^{BOS} / k_B T}$$

Partition function

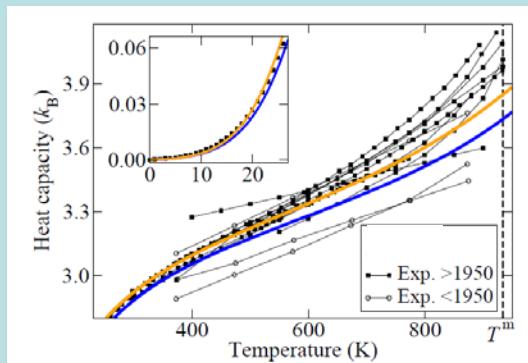


Phase diagram

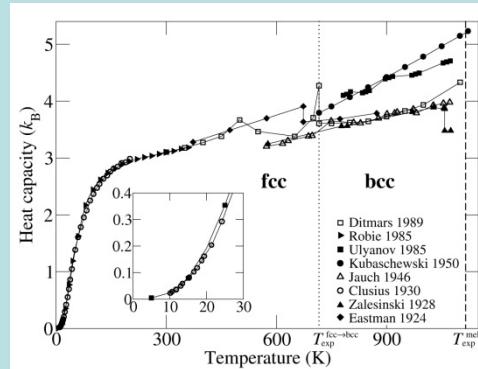
Do we have to go beyond experiment?



Calorimetric measurements



fcc Al



fcc/bcc Mg

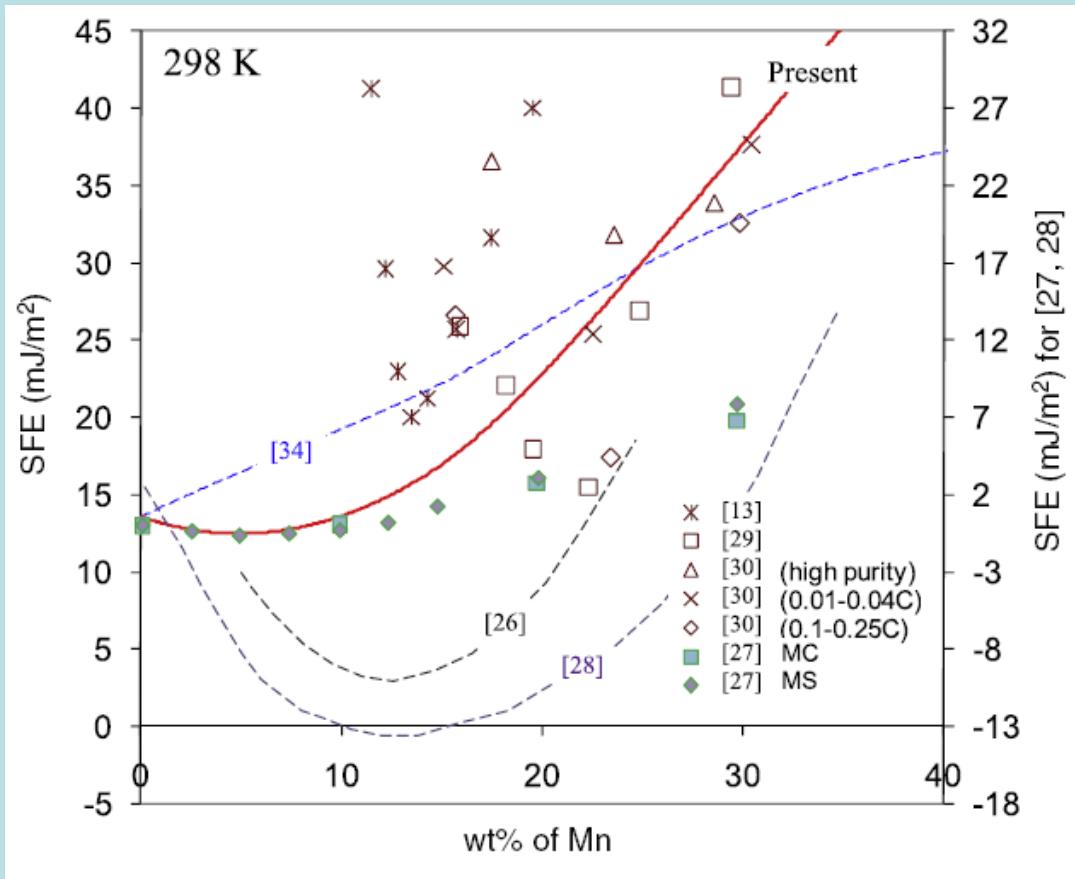
Fundamental input for all thermodynamic databases

→ But: Scatter of ~0.3 ... 1 k_B

Point defects (vacancies): Formation energies and entropies

	Al	
	Exp.	DFT
E_f (eV)	0.7	0.6
S (k_B)	2.4	0.2

Stacking fault energies (fcc Fe-Mn)



Key quantity to design
novel high-strength
steels

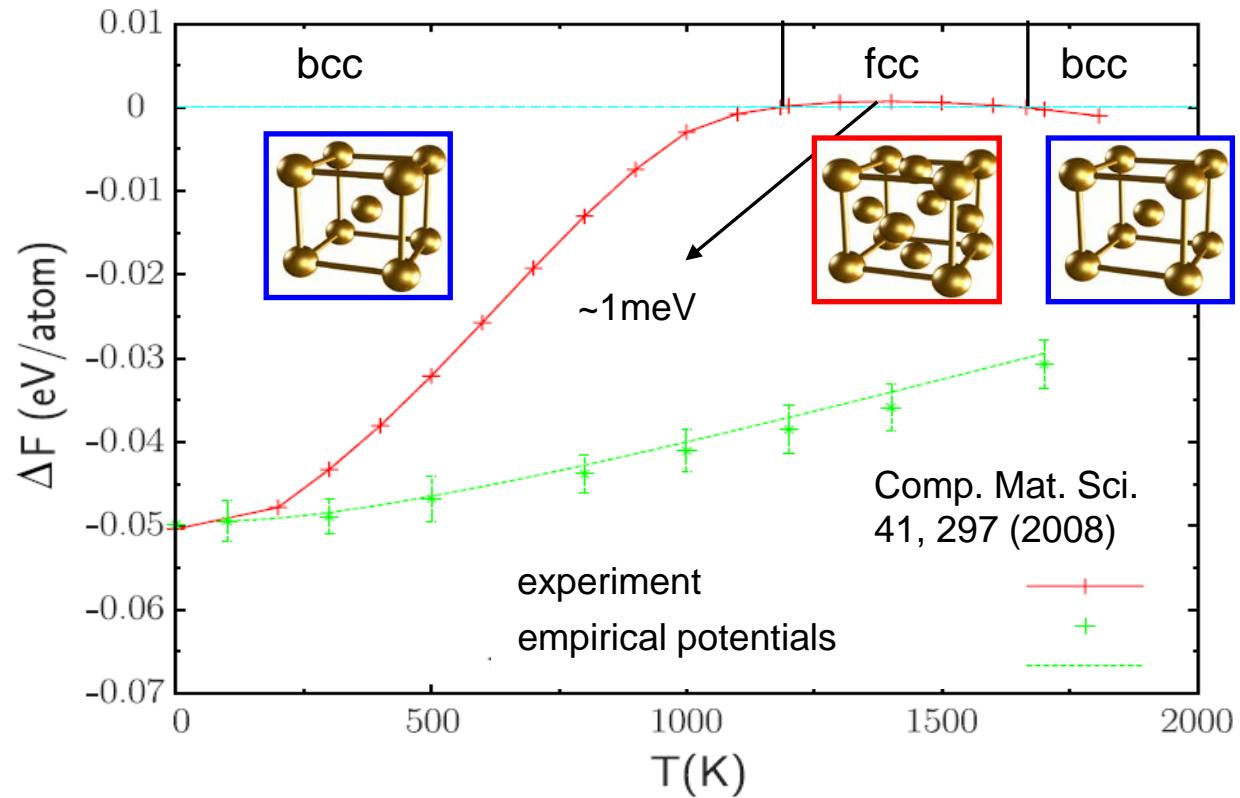
Additional complication
→ magnetism

Even chemical trends are hard to derive from existing data

Accuracy



Free energy difference between bcc and fcc iron



Energy resolution better 1 meV!

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

Ab initio Thermodynamics



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

$$= \sum_{\{\vec{R}_I, Z_I, \sigma_I, f_i, \dots\}} e^{-E^{BOS}(\{\vec{R}_I, Z_I, \sigma_I, f_i, \dots\})/k_B T} \Big|_{V, T, x}$$

Statistical averages over coordinates, magnetic moments, occupations, chemical compositions

$$= \sum_{\{\vec{R}_I\}} e^{-E^{BOS}\left(\{\vec{R}_I\}; \left\{Z_I, \sigma_I, f_i, \dots\right\}_{fixed}\right)/k_B T} \Big|_{V, T, x}$$

Vibrational excitations

$$\times \sum_{\{f_i\}} e^{-E^{BOS}\left(\{f_i\}; \left\{\vec{R}_I, Z_I, \sigma_I, \dots\right\}_{fixed}\right)/k_B T} \Big|_{V, T, x}$$

Electronic excitations

Adiabatic approximation

+ cross terms

e.g. electron-phonon interactions

Accuracy considerations



$$F(V, T) = E_{T=0K} + F^{\text{qh}} - \underbrace{F^{\text{ah}} + F^{\text{mag}}}_{\text{challenging}} + F^{\text{el}} + F^{\text{vac}} + F^{\text{non-adiab}}$$

~0.1 meV/atom

~0.1 meV/atom

< 1 meV/atom

The diagram shows the decomposition of the force $F(V, T)$ into various components. A bracket above the first two terms ($E_{T=0K}$ and F^{qh}) is labeled ~0.1 meV/atom. A red circle highlights the sum of the next two terms, F^{ah} and F^{mag} . Red arrows point from this highlighted term to a central box labeled "challenging". Above the last four terms (F^{el} , F^{vac} , $F^{\text{non-adiab}}$), another bracket is labeled ~0.1 meV/atom. Below the entire equation, a final bracket groups all terms except $E_{T=0K}$ and F^{qh} , labeled < 1 meV/atom.

$$\langle E(T) \rangle = \lim_{\Delta t \rightarrow \infty} \frac{1}{\Delta t} \int_{t=t_0}^{t_0+\Delta t} E^{\text{BOS}} \left(\left\{ \vec{R}_I(t) \right\} \right) dt$$

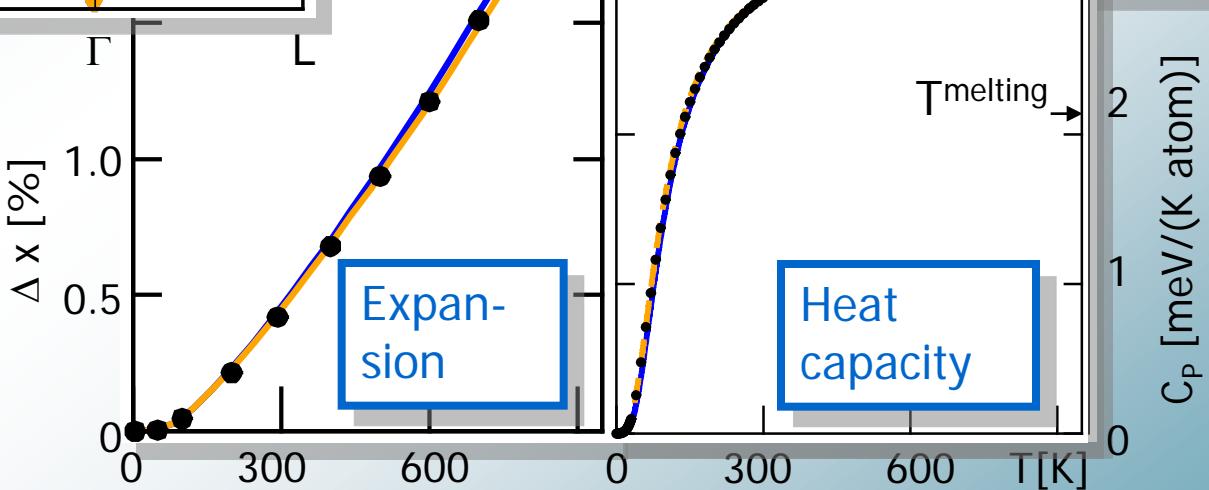
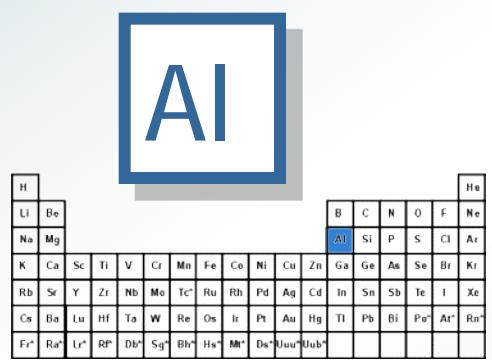
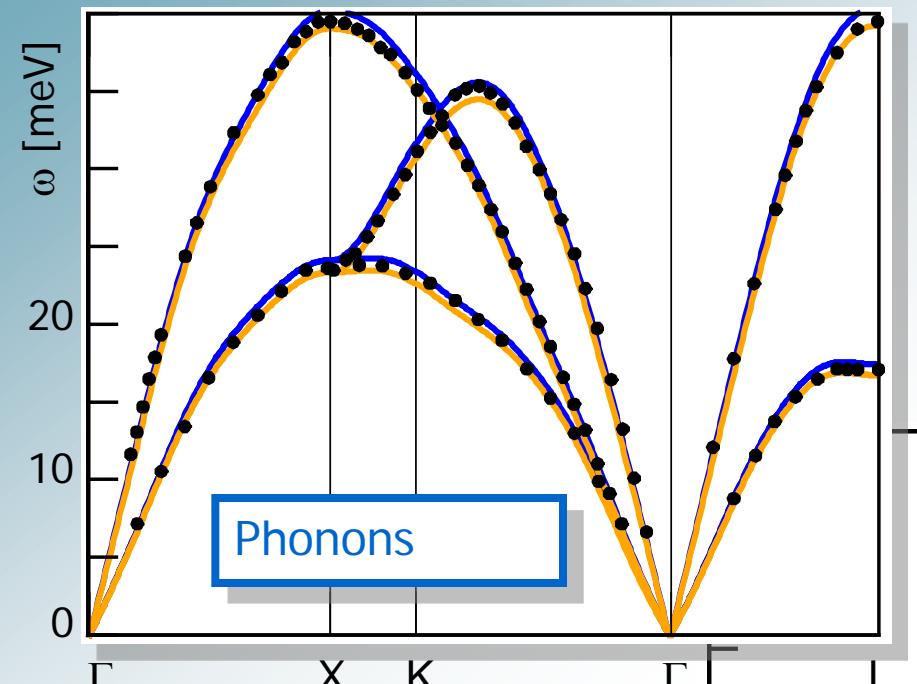
10⁷ configurations (~ 10 temperature steps)
a few hours/days

Statistical averages
with 1meV accuracy

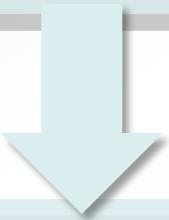


Are contributions beyond quasiharmonic approximation relevant?

Example: Bulk (fcc) Aluminum

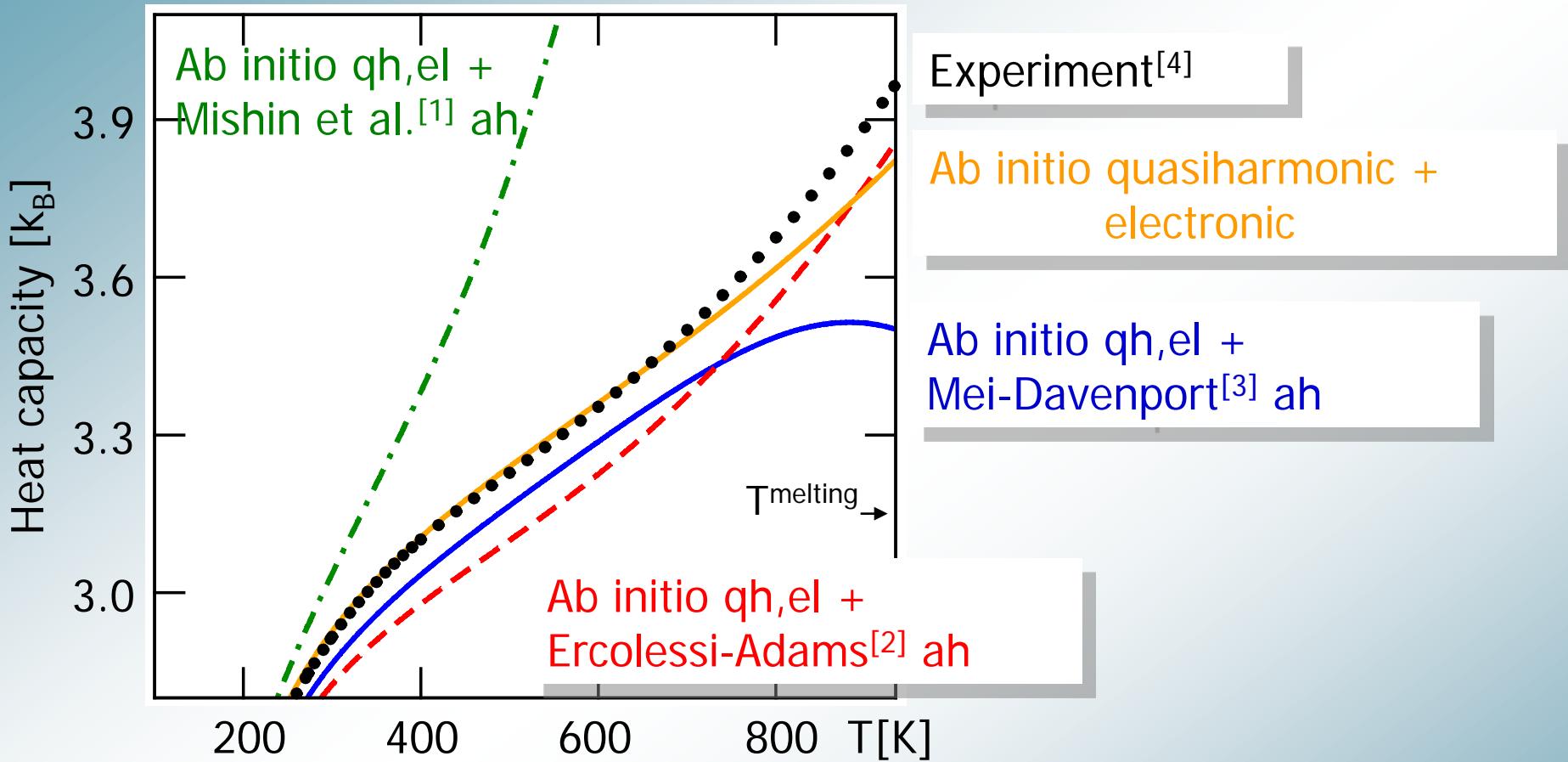


How to sample over 10^7 configurations with ab initio accuracy?



Can we use empirical potentials to describe anharmonic contributions

Heat capacity of bulk Aluminum



→ None of the available empirical potentials is able to describe the anharmonic contribution

- [1] Y. Mishin, et al., Phys. Rev. B 59, 3393 (1999).
- [2] F. Ercolessi and J. B. Adams, Europhys. Lett. 26, 583 (1994).
- [3] J. Mei and J. Davenport, Phys. Rev. B 46, 21 (1992).
- [4] D. A. Ditmars, et al., Int. J. of Thermophys. 6, 499 (1985).

Coarse graining configuration space



Main challenge:

Reduce number of (ab initio) configurations by several orders of magnitude

$$\langle U(T) \rangle = \frac{1}{N} \sum_i^N E^{BOS} \left(\left\{ \vec{R}_I(t_i) \right\} \right)$$

from MD or MC

Two major concepts

Thermodynamic integration

Free energy perturbation

Thermodynamic Integration

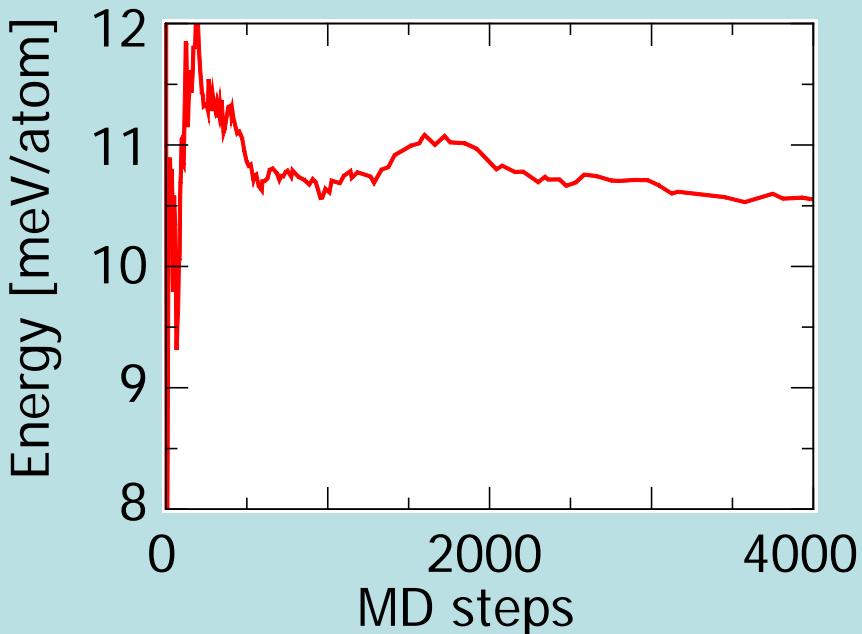
Key idea: Compute free energy change between reference system A and real system B

$$\Delta F(A \rightarrow B) = \int_0^1 \left\langle \frac{\partial U(\lambda)}{\partial \lambda} \right\rangle_\lambda d\lambda$$

with

$$U(\lambda) = U_A + \lambda(U_B - U_A)$$

MD simulation in TI-step



Application straightforward if good reference is available

Typically the number of configurations can be reduced by 1-2 orders of magnitude
 → several 10^4 configurations

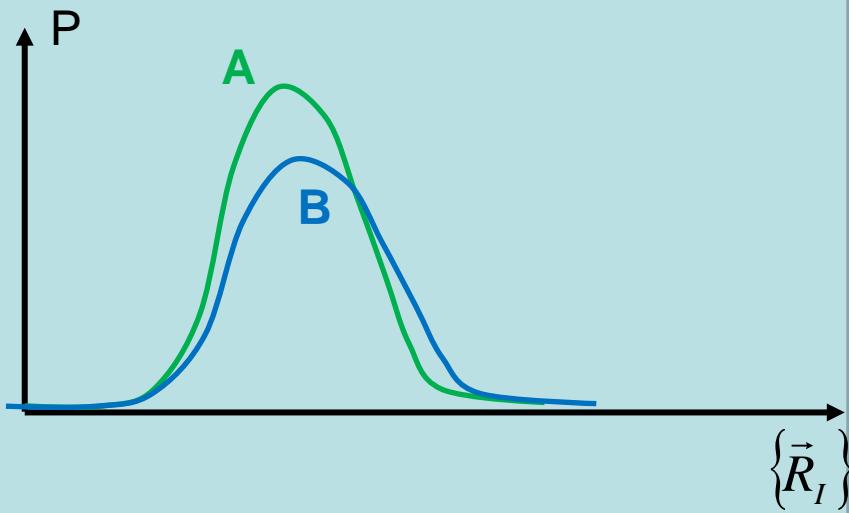
Not affordable on highest ab initio level

Free energy perturbation



Key idea: Compute free energy change between reference system A and real system B

$$\Delta F(A \rightarrow B) = -k_B T \ln \left\langle \exp \left(-\frac{E_B - E_A}{k_B T} \right) \right\rangle_A$$



Performance increases with quality of reference

For large differences to reference the method becomes inefficient/fails

For the targeted accuracy less efficient than thermodynamic integration

How to boost coarse graining?



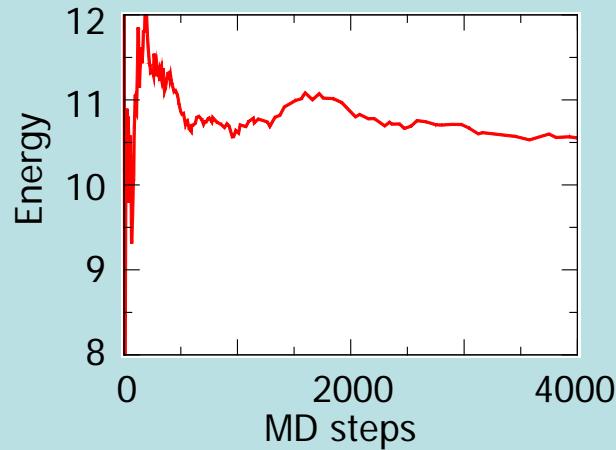
Cycles in thermodynamic integration

$$\Delta F(A \rightarrow B) = \int_0^1 \left\langle \frac{\partial U(\lambda)}{\partial \lambda} \right\rangle_\lambda d\lambda$$

λ integration (2-10 steps)

→ Improved ref. reduces step number

Thermodynamic average
($10^3 \dots 10^4$ MD steps)



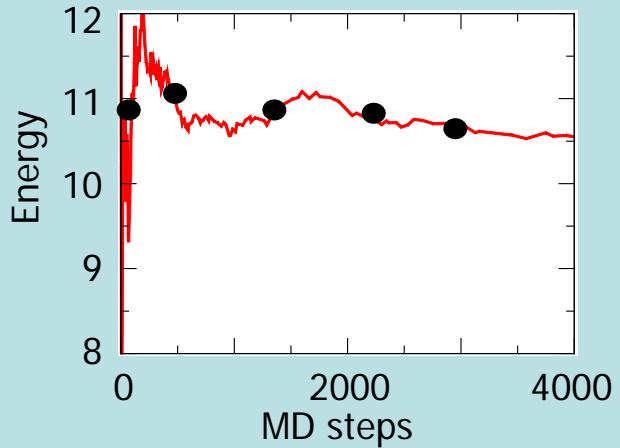
Performance bottleneck

λ integration (2-10 steps)

- Improved reference reduces step number
- Here: Quasiharmonic reference

Thermodynamic average (10³...10⁴ MD steps)

- Use free energy perturbation approach
- Use low/medium converged DFT as reference



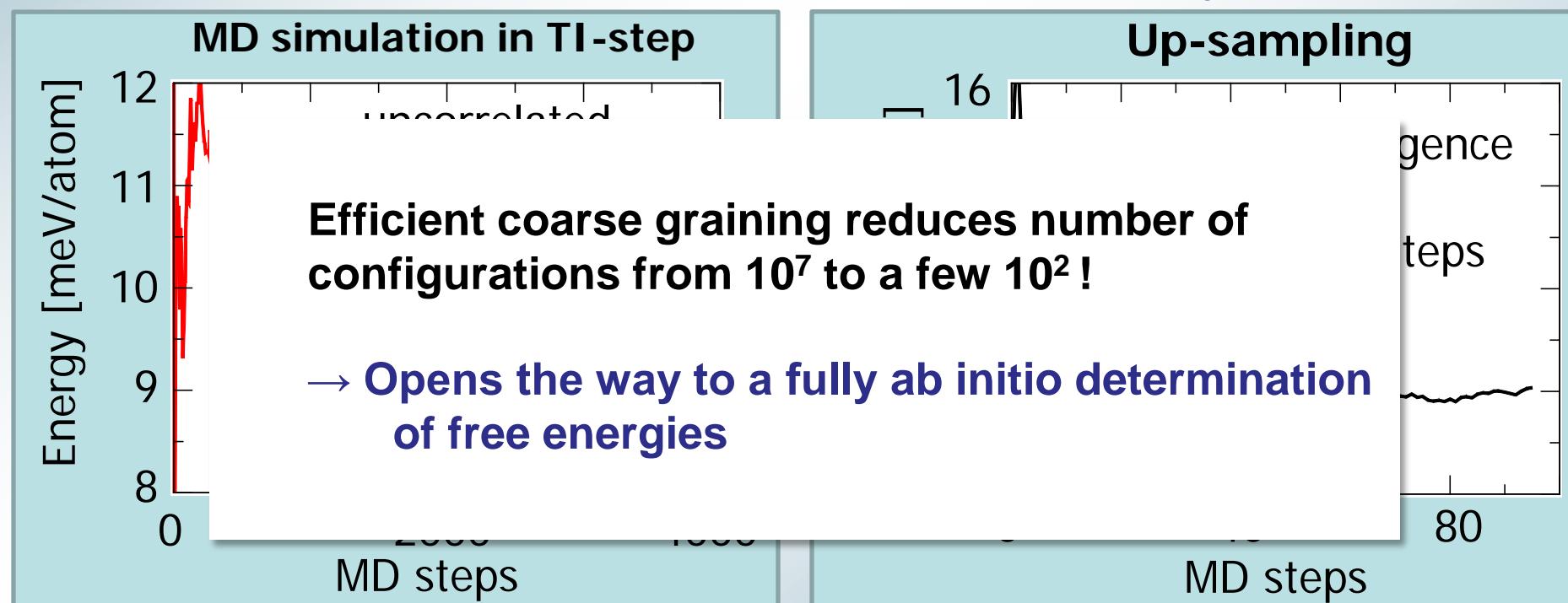
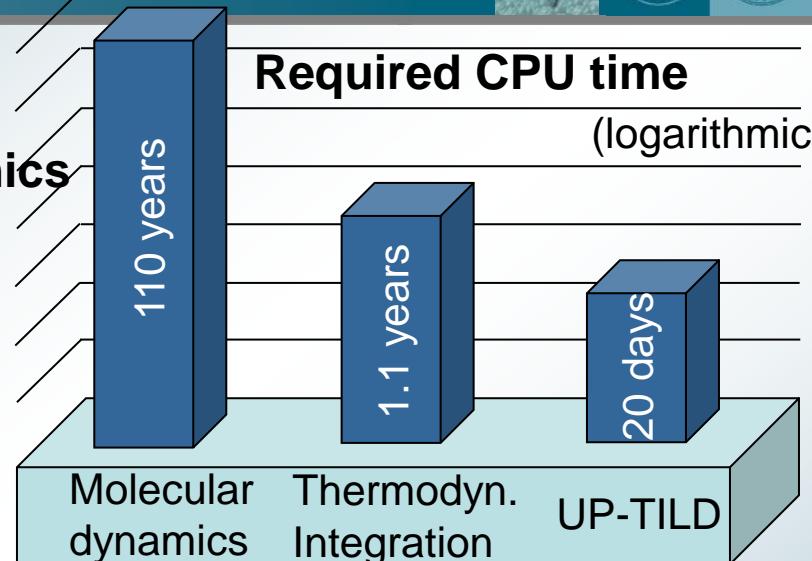
→ Typically reduces number of configurations by 10²

Performance of the new approach



- Wavefunction extrapolation
- Thermodyn. integr. (TI) with Langevin dynamics
- Ensemble average instead of time average
(parallelization)
- Up-sampling in λ -TI step
- etc.

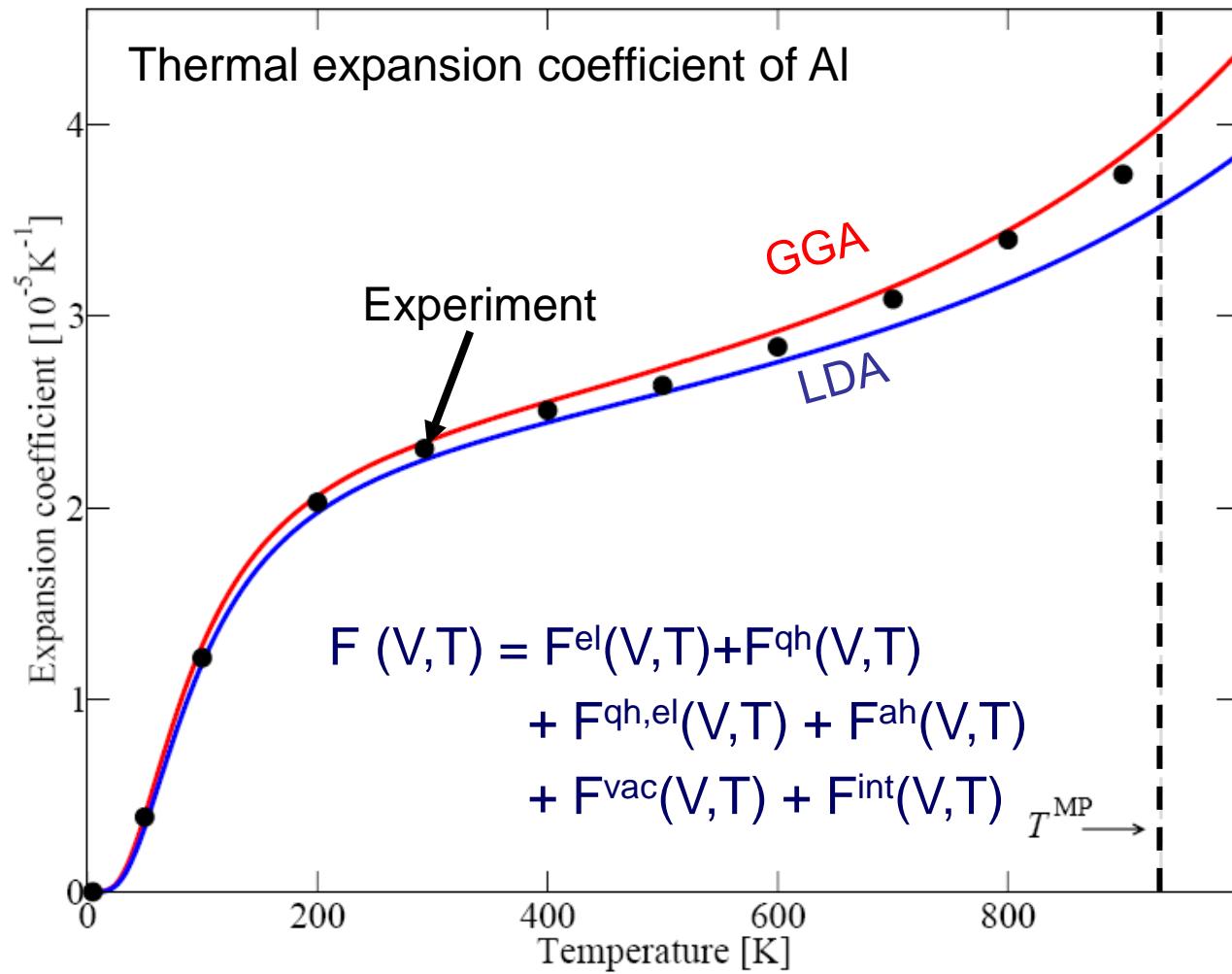
Grabowski et al., Phys. Rev. B79, 134106 (2009).





Benchmark against experiment

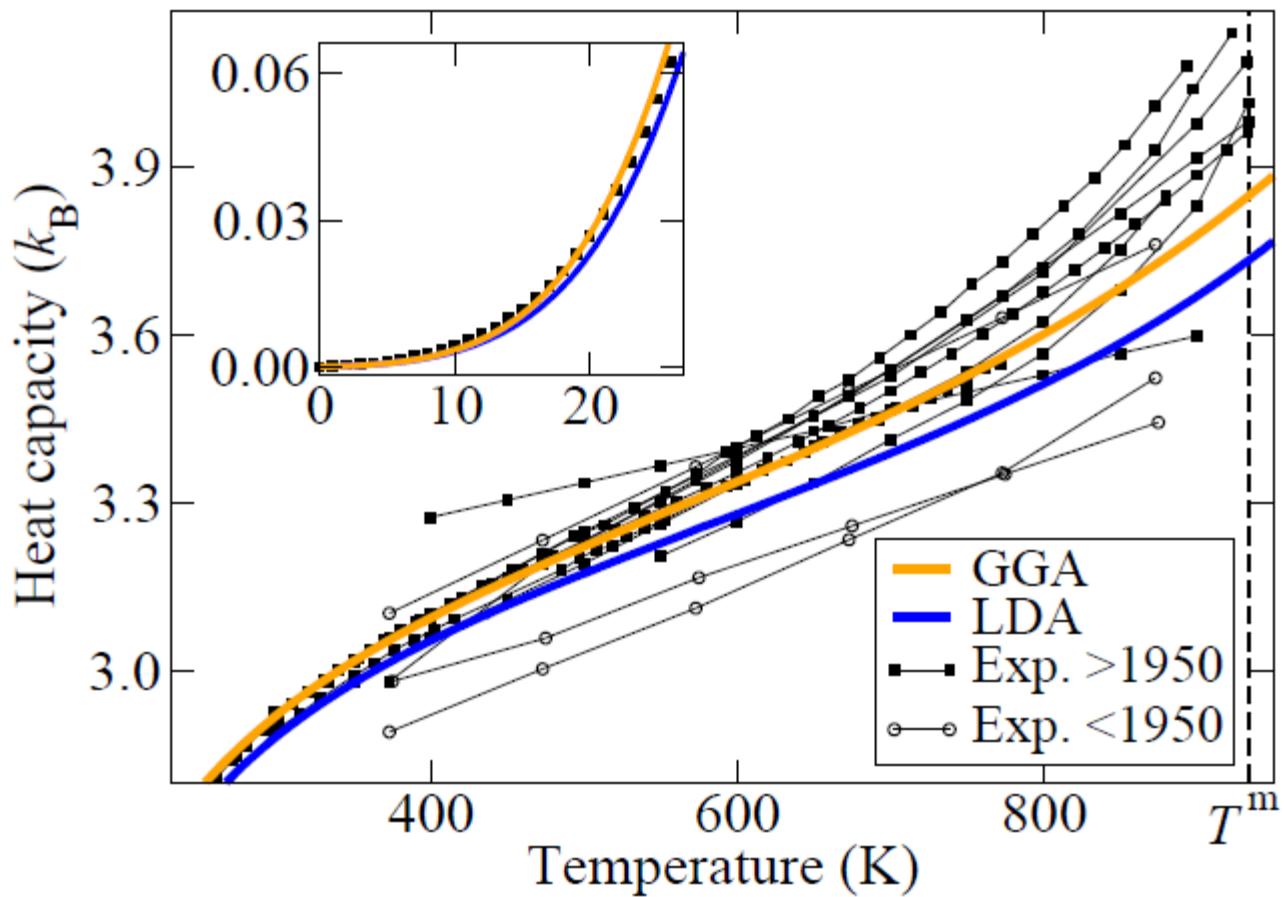
Thermal expansion coefficient



- Excellent agreement with experiment
- Systematic trend: LDA and GGA provide approximate measure of error bars

Grabowski, Ismer, Hickel, Neugebauer, Phys. Rev. B 79, 134106 (2009)

Heat capacity of Al



→ DFT gives lower bound to all recent experiments

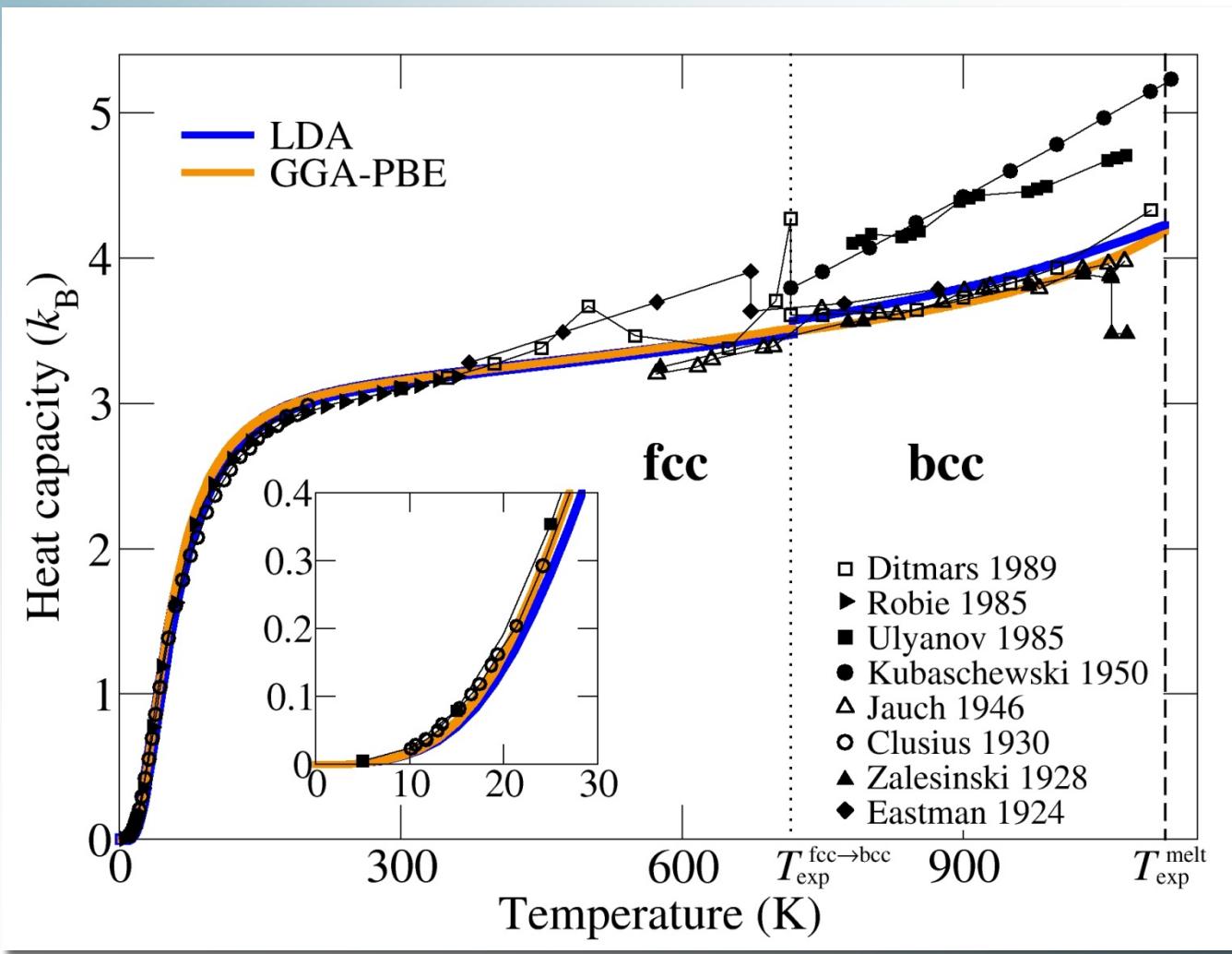


Applications

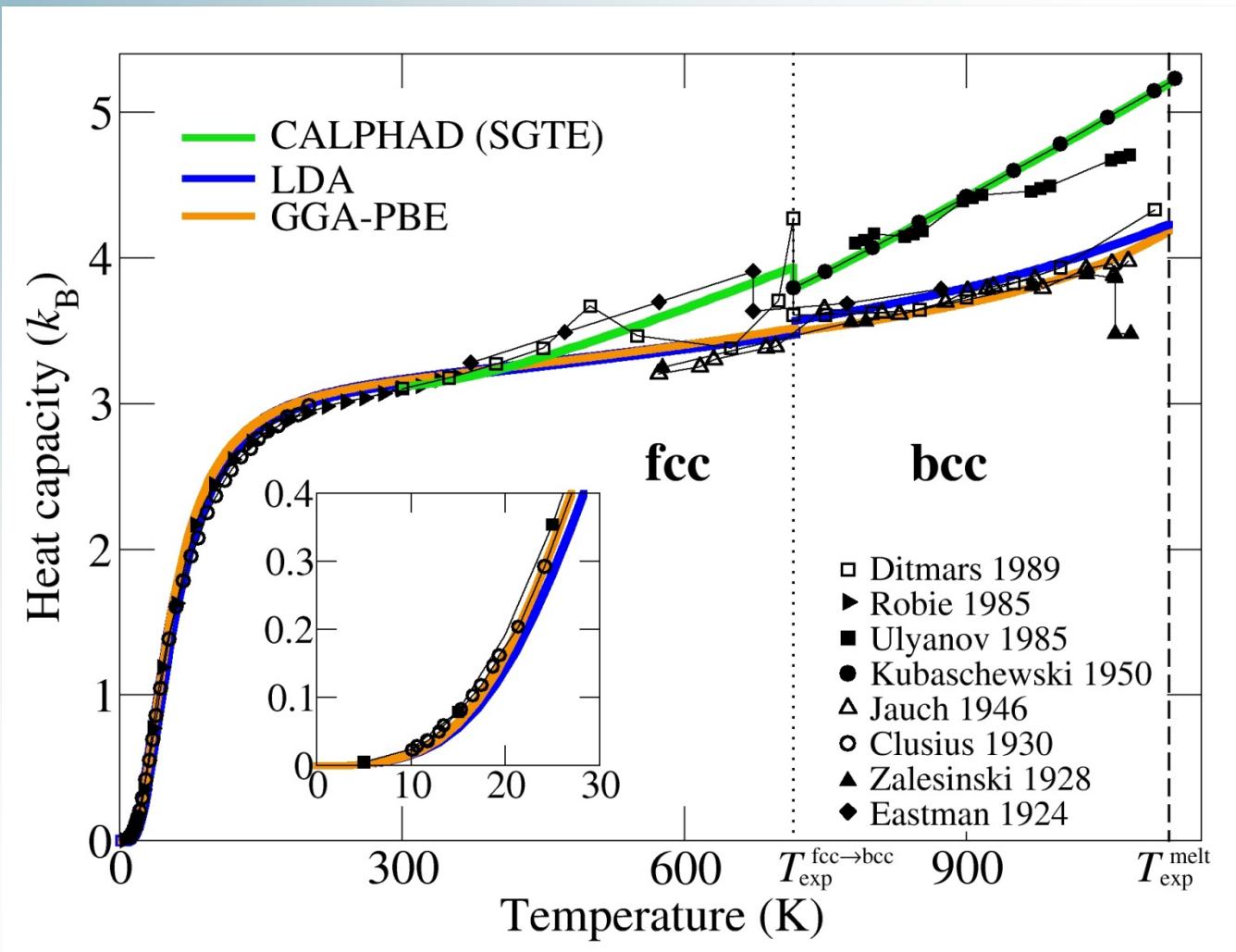


Assessment of experimental data

Calcium: Heat capacity



Calcium: Heat capacity



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

Accuracy often exceeds experimental data even of stable phases

→ Provide excellent basis to compute thermodynamic data



Thanks to the department





Thanks for your attention