

## CMD® Case Studies (2)

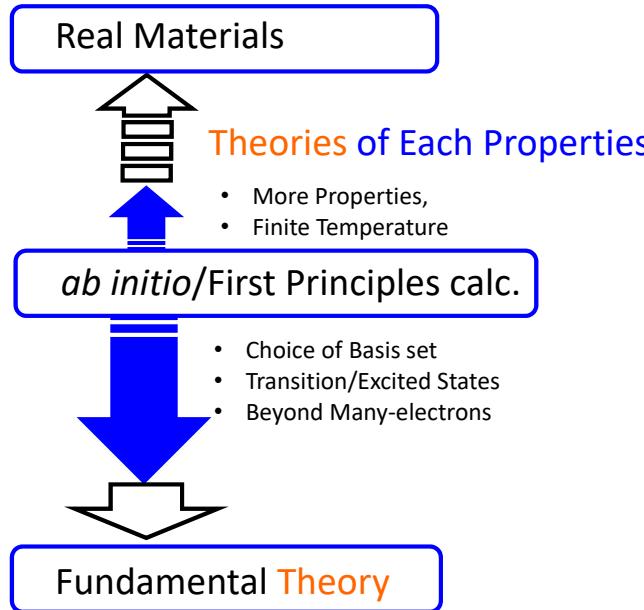
## Theoretical Calculations by Computations to Go beyond Theories

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and Collaborators

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### Theories & *ab initio* Calculations



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## Contents

- ✓ Introduction to Computation (*ab initio* and beyond)
- ✓ Thermal Conductivity
- ✓ Thermal Expansion
- ✓ Conclusions

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### Three Ways of Computations

#### ✓ Simulation

To reproduce something, and identify governing factors

#### ✓ Theoretical Calculation

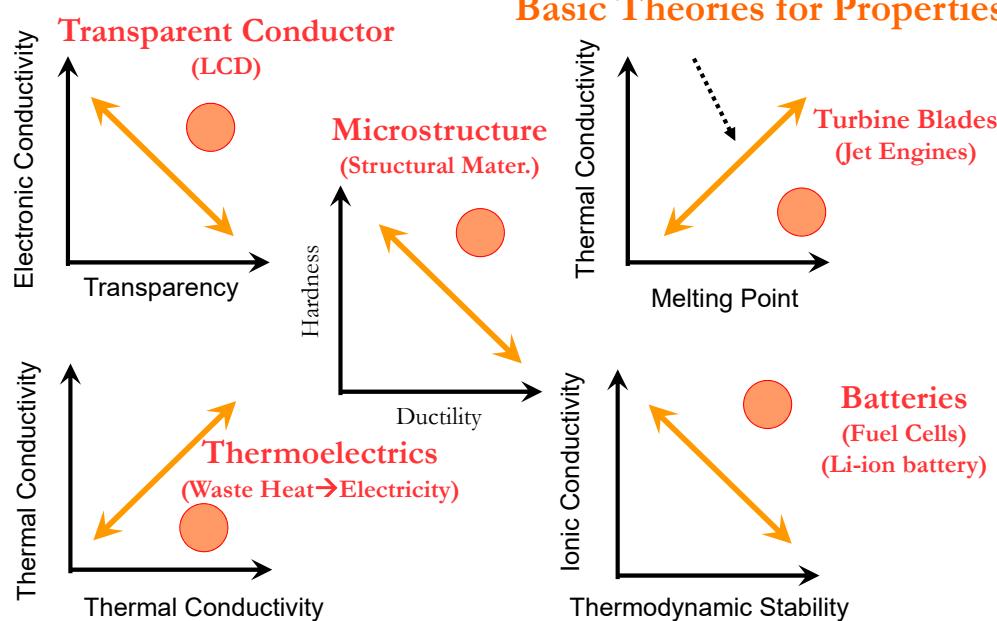
To use no theory for properties, but fundamental theory

#### ✓ Computational Experiment

To do experiments in computers

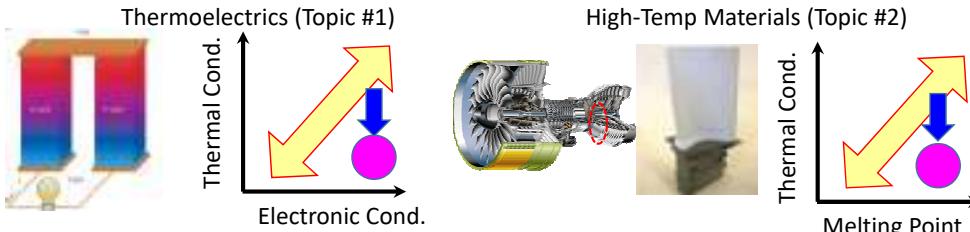
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# Conflicting Demands for Materials



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## Selective Control of Thermal Conduction



### Problems:

- Easy to decrease thermal conductivity ALONE
- Conventionally, discussing “Mean Free Path” ← Length of Defects  
→ Remains qualitative → No quantitative guideline
- Unclear: Selective control of thermal conduction without deteriorating other properties needed

→ Through computations,  
Guidelines to control beyond correlation or trade-off

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# Layered Thermoelectric Oxides

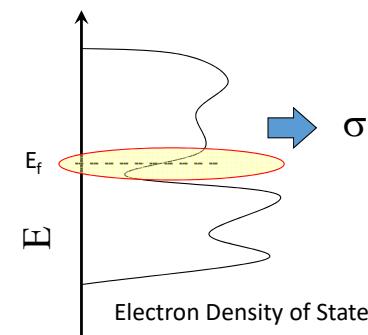
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## Similarities and Differences: (Electrons and Phonons)

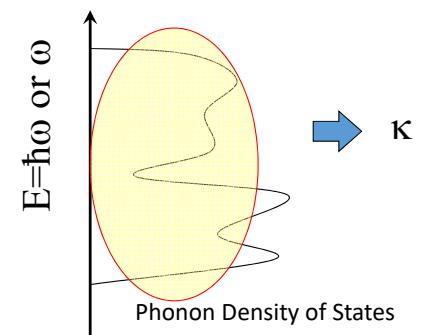
- ~1960: Equally discussed and theories developed
- After discovery of semiconductors: Phonons left behind electrons
- Reactivated in 21st century → Phonon conduction is complicated

**Electrons**  
Fermi-Dirac statistics



Only Electrons near Fermi level contribute to  $\sigma$

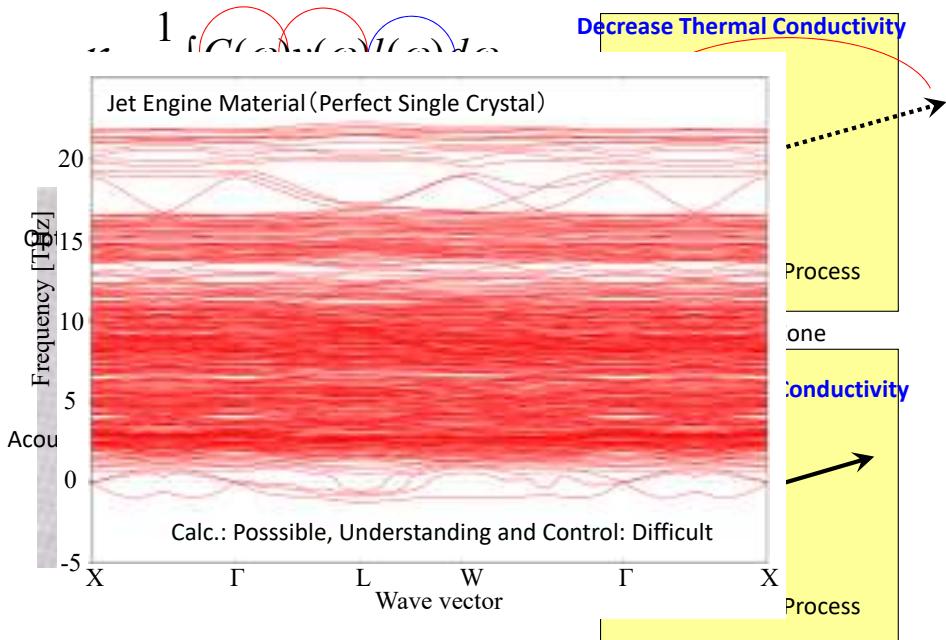
**Phonons**  
Bose-Einstein statistics



All the phonons contribute to  $\kappa$

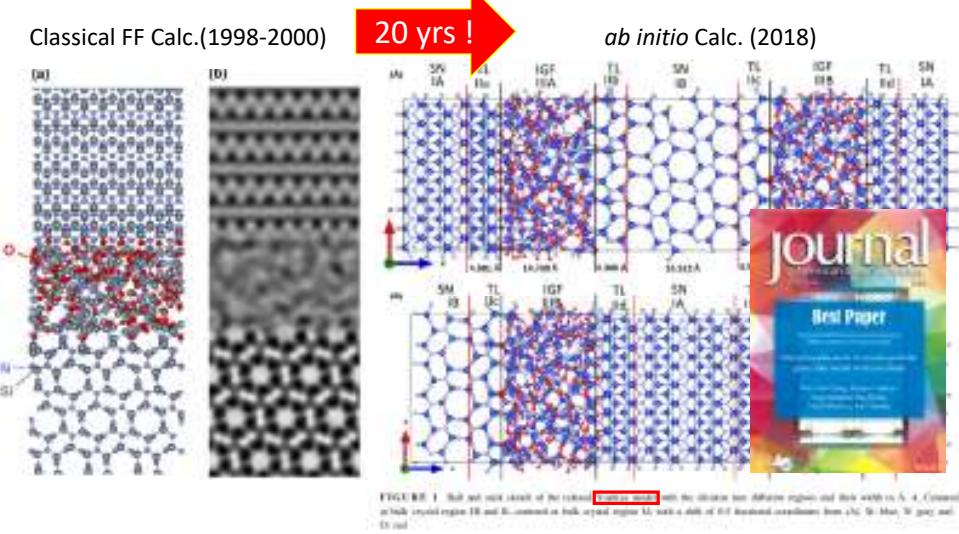
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# Theories and Reality



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# Intergranular Film ( $\sim 1\text{nm}$ )



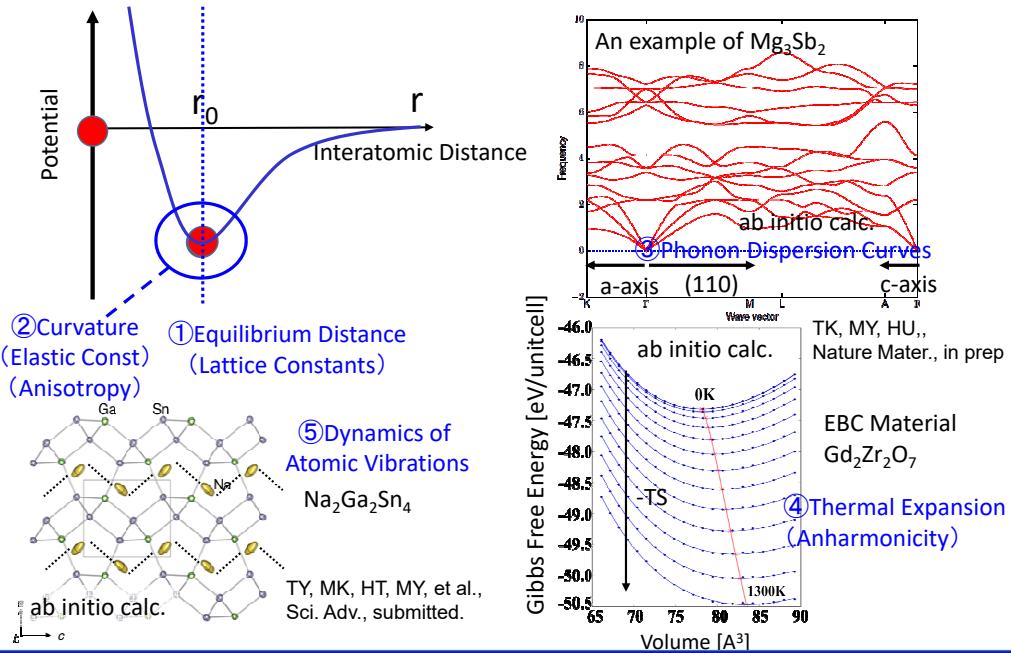
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# Approaches to Thermal Conduction

1. Phonons: Classical MD (Modeling)
2. Force-Field: From *ab initio* calc.
3. Mechanism: Original ways
3. Guideline for control Computational Experiment

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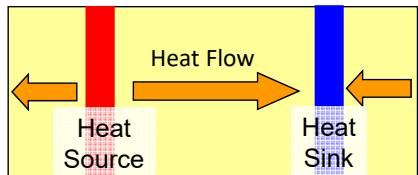
# Example: *ab initio* calc. $\rightarrow$ Force Field



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# Thermal Conductivity: Existing Methods

## Direct Method (1975)



Advantage: Path of Heat flow  
Disadvantage: Artificial Scattering  
Problem: Only  $\kappa$

## Equilibrium MD

### Green-Kubo Equation (1957)

$$\kappa = \frac{V}{k_B T^2} \int_0^\infty \langle J_x(\tau) J_x(0) \rangle d\tau$$

Advantage: No artificial Scattering  
Disadvantage: Slow convergence  
Problem: Only  $\kappa$



## New Method (From Theory to Implementation)

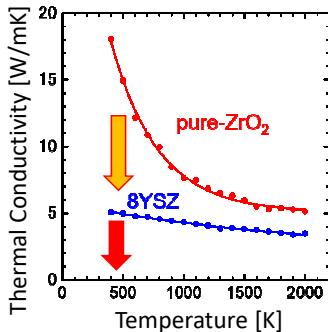
- Not only greater/lower  $\kappa$
- How  $\kappa$  is determined  
→ Extension of existing theories

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# Comparison #1: Jet Engine Material

$\sim RT$

	Calc.	Exp.	Error
ZrO <sub>2</sub>	18.5	8.1	228%
8YSZ	5.1	2.3	222%
Decrease	71.9%	71.6%	



Relative change: Okay



Phonon Scattering: Okay



Discussion on the safe side can be made (confined to Relative change)

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# Original Method: Calc. & Analyses

## Perturbed MD

M. Yoshiya et al., (2004)

$$\dot{\mathbf{r}}_i = \mathbf{p}_i / m$$

$$\dot{\mathbf{p}}_i = \mathbf{F}_i + \tilde{\mathbf{D}}_i \mathbf{F}_{ext}$$

R. Kubo (1957)

Linear Response Theory  
Fluctuation Dissipation Theorem

D. J. Evans (1982), M. J. Gillan (1983)

$$\kappa = \frac{1}{T} \lim_{t \rightarrow \infty} \lim_{F_{ext} \rightarrow 0} \frac{\langle J_{Qx}(t) \rangle}{F_{ext}}$$

$$J_{Qx}(t) = \sum_i \{ e_i \mathbf{v}_i + \mathbf{r}_{ij} (\mathbf{F}_{ij} \cdot \mathbf{r}_{ij}) \} / V$$

- Advantage: Enables various analyses → Enable to identify mechanisms

Quantification of each elements' contribution to  $\kappa$

$$\kappa = \kappa_{Na} + \kappa_{Co} + \kappa_O$$

Idea from LCAO of ab initio calc.

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# Comparison #2: Thermoelectrics

[W/mK]	300 K	800 K
(a) NaCoO <sub>2</sub>	41.6	14.9
(b) Na <sub>0.5</sub> CoO <sub>2</sub>	20.7	10.9
(c) Na <sub>0.5</sub> CoO <sub>2</sub>	6.52	5.45
(d) Na <sub>0.5</sub> CoO <sub>2</sub> <sup>†</sup>	19.0	5.1

<sup>†</sup> K. Fujita et al., 2001

Fine to find agreement, but why?

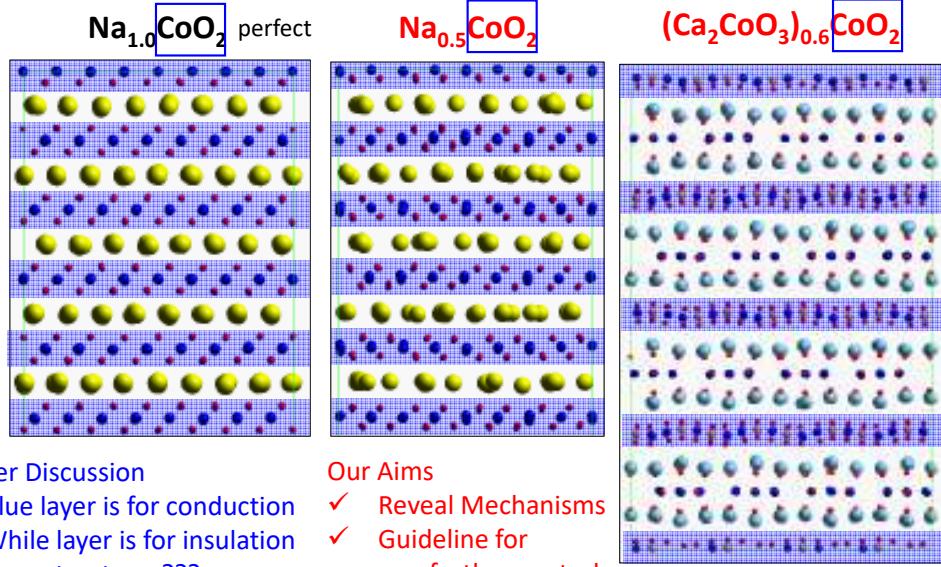
→ Cancellation of two opposite errors

(Group Vel. & Formal Charges)

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# Layered Thermoelectric Oxides

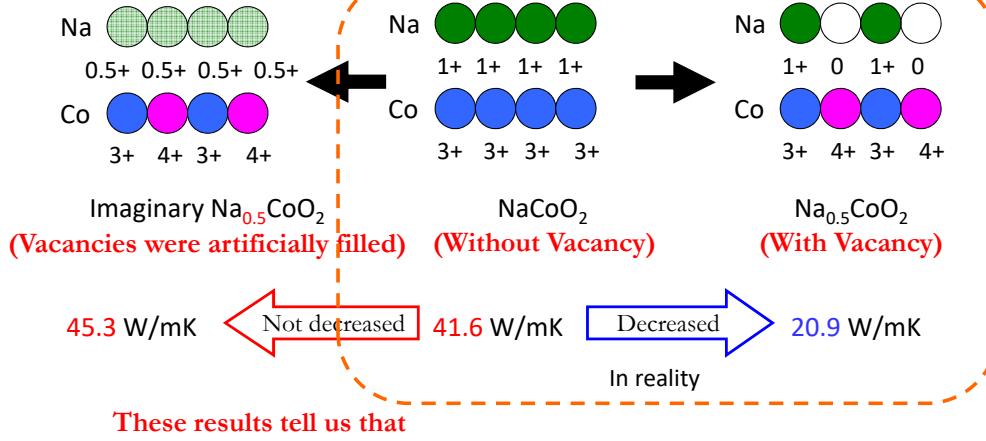
Electronic properties: Understood Low Thermal Conductivity: ???



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## Computational Experiment #1

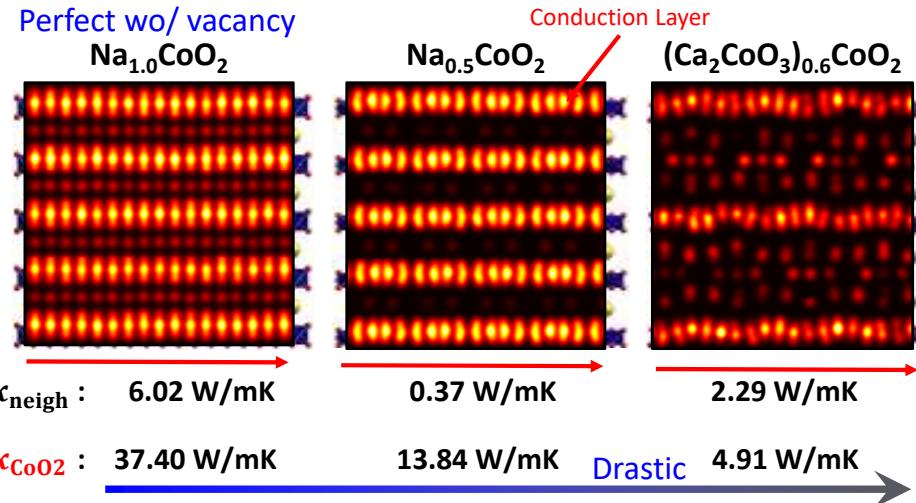
### Impact of Na Vacancies (with Co valence ordered)



The story would not be changed even if Co charge conf. is disordered at high  $T$ .

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# Observations beyond Experiment



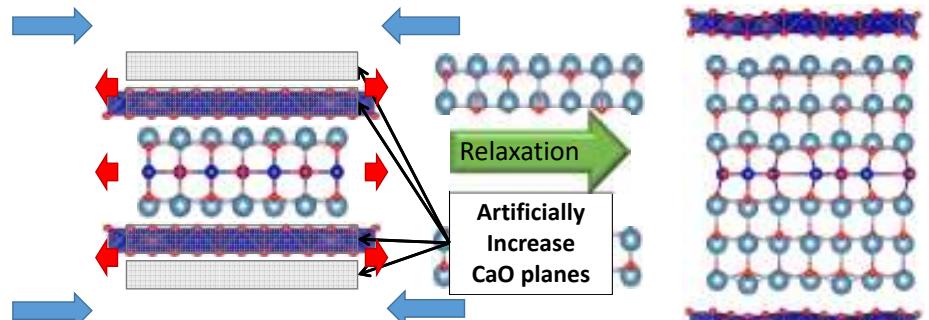
- Interlayer interaction suppress thermal conduction
- Without deteriorating electronic properties

SF, MY, CAJF, Sci. Rep. (2018)

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## Computational Experiment #2

### $(\text{Ca}_2\text{CoO}_3)_{0.6}\text{CoO}_2$ : Misfit-layered Structure

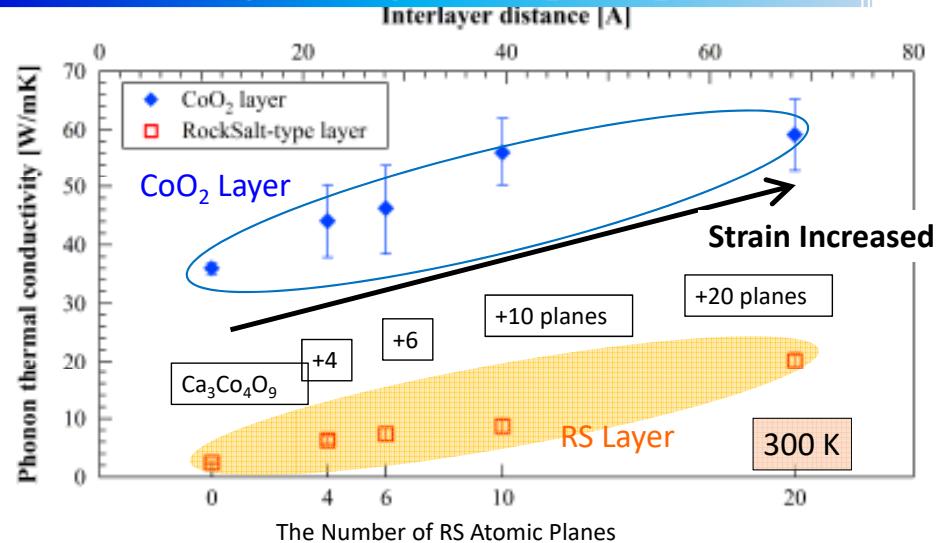


Artificially increase the number of atomic planes  
→ Imposes more misfit and strain to  $\text{CoO}_2$  layer  
→ Question: Whether thermal conductivity will increase or decrease?

Misfit is rather increased

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# Understanding through Comp. Exp.



With the increase of misfit, thermal conductivity is increased

→ Interlayer Dynamic Interaction determines  $\kappa$

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# Anharmonicity

Anharmonicity: Origin of Phonon Scattering

$$U = U_0 + \frac{1}{1!} \frac{\partial U}{\partial \mathbf{r}} + \frac{1}{2!} \frac{\partial^2 U}{\partial \mathbf{r}^2} + \frac{1}{3!} \frac{\partial^3 U}{\partial \mathbf{r}^3} + \frac{1}{4!} \frac{\partial^4 U}{\partial \mathbf{r}^4} + \dots$$

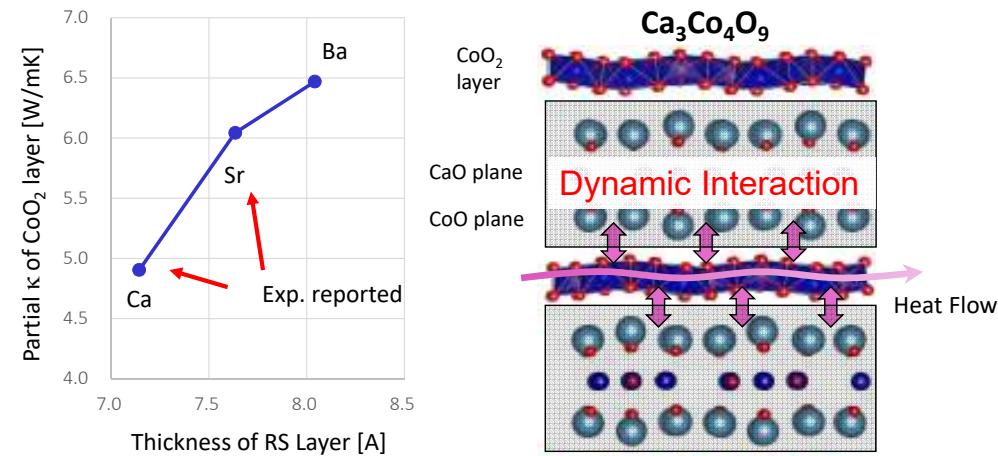
Harmonic  $\frac{\partial U}{\partial \mathbf{r}} = -\mathbf{F}$

$$U = U_0 + \frac{1}{2} \frac{\partial^2 U}{\partial \mathbf{r}^2} + \frac{1}{6} \frac{\partial^3 U}{\partial \mathbf{r}^3} + \frac{1}{24} \frac{\partial^4 U}{\partial \mathbf{r}^4} + \dots$$

EVERYTHING ELSE is categorized as “anharmonicity”

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# Exp. Observation Understood

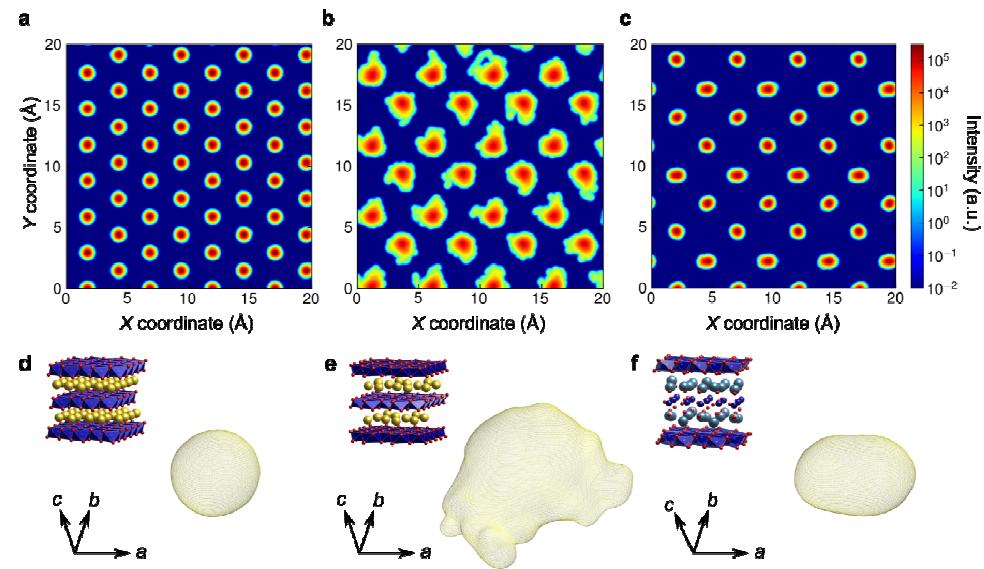


Elucidated unsolved mechanisms  
(Increased  $\kappa$  with Larger Misfit)

S.F, MY, J. Electron. Mater., (2016)

SF, MY, J. Electron. Mater., (2014)

# Variety of “Anharmonicity”



個々の原子振動が非調和的

集団で非調和的

SF, MY, CAJF, Sci. Rep. (2018)

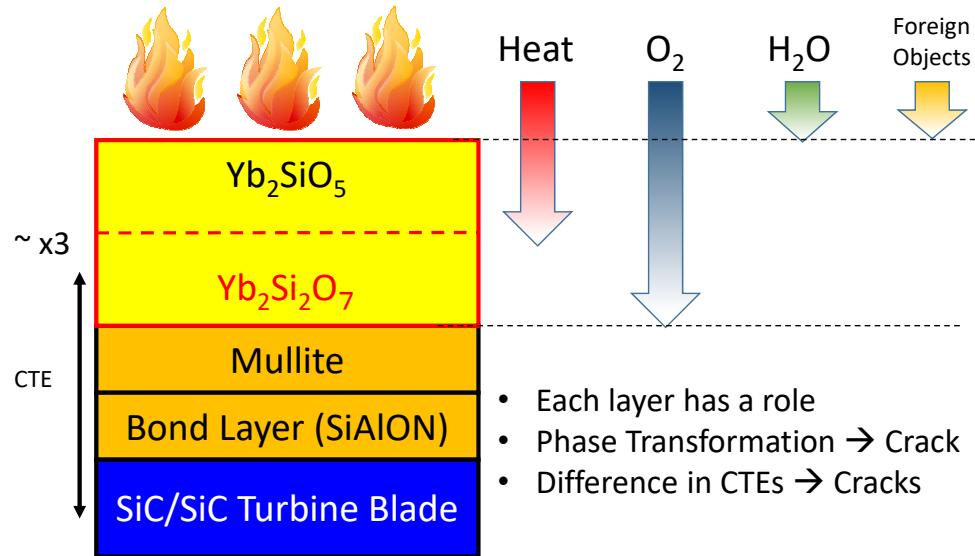
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# CTE: Coeff. Thermal Expansion

- ✓ Introduction to Computation (ab initio and beyond)
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## Multilayers of EBC



The most serious concern is lifetime.

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# Thermal Expansion: EBC



EBC: Environmental Barrier Coatings

## Thermal Cycle of Turbine Blade



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## Mitigate Thermal Fatigue and Fracture

1. Suppress Phase Transformation: Gibbs Free Energy (at high T & P)
2. Control CTE: Anharmonicity?

J. Eur. Ceram. Soc, (2019)

Grüneisen parameter (anharmonicity)

Differences attributed to  $\gamma$  (Conventional)

$$\alpha = \frac{\rho C_V \gamma}{K_T}$$

$\alpha$ : Coeff. Thermal Expansion

$\rho$ : Density (Mass)

$C_V$ : Specific Heat

$K_T$ : Elastic Constant

$\gamma$ : Grüneisen parameter

Questions left:

- How to change anharmonicity of phonons?
- Whether thermal conductivity is sacrificed or not?
- Can we use the equation above?

→ Directly calculate equilibrium volume at each T having minimum Gibbs free energy

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# Approaches to Thermal Expansion

1. CTE  $\sim 10^{-6}/K$ : *ab initio* Calc.
2. Phonons: Lattice Dynamics (not MD)
3. T dependence: “Quasi-”harmonic Approx.
4.  $f$ -electrons: Almost frozen (pseudized)
5. Crystal Symmetry: Not fixed (exp. at high T)
6. Preliminary: Machine Learning

Validity of these assumption verified before main calc.  
(Vol.: -0.5% underestimated, CTEs are good agreements with exp.)

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# Conclusions #1

For computational studies to do some role,  
It is critically important

- To fully understand advantages and limitations of each method
- To carefully set a problem (What to understand)
- To discuss experimentalist beforehand

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# Conclusions #2

It is probably a good idea

## For Experiments

To talk with computer guys  
not for ideal values or theoretical values  
but to sort out complexity of reality  
and to find out mechanism behind phenomena

## For computer guys

To go out to find that world is wider  
To talk with your colleague to find out what to calculate

## For Theorist (Analytical)

To let computers help you to solve your problem  
while sleeping

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