

COLUMBIA  
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# A Python code for ***thermoelasticity***

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Cij paper on **arXiv**  
[arxiv.org/abs/2101.12596](https://arxiv.org/abs/2101.12596)



Cij code on **GitHub**  
[github.com/mineralscloud/cij](https://github.com/mineralscloud/cij)





# Outline

- Background
- Static elasticity calculation
- Review of the SAM-Cij method
- Usage
- Examples
- Summary



# Background

- **Elasticity at high-PT**
  - Elastic tensor ( $C_{ij}$ ) vs.  $PT$  and acoustic velocities can provide geophysical insights (e.g., composition and temperature in the Earth's interior) by helping the *interpretation of seismological observations*.
  - Despite recent developments, *measuring  $C_{ij}$  at relevant conditions is still extremely challenging*.
- **Ab initio high-PT  $C_{ij}$** 
  - *Traditional methods* to compute  $C_{ij}$  ( $P,T$ ) require phonon / MD runs on strained crystal configurations at each  $PT$  which is *extremely time consuming*.
  - A *semi-analytical method (SAM)* to evaluate the thermal  $C_{ij}$  (SAM-Cij) was developed by **Wu and Wentzcovitch (2011)** [1,2] as an alternative. Its predictions show *good agreement with measurements* on many complex minerals.

1. F. Zou, Z. Wu, W. Wang, R. M. Wentzcovitch, *Journal of Geophysical Research: Solid Earth*. **123**, 7629–7643 (2018).
2. Z. Wu, R. M. Wentzcovitch, *Phys. Rev. B*. **83**, 184115 (2011).

## Static elasticity calculation

- Static elastic coefficients are calculated using the stress vs strain method.
- we use Hooke's law to calculate the corresponding elastic tensor coefficient term:

$$\sigma_{ij} = C_{ijkl} \epsilon_{kl}$$

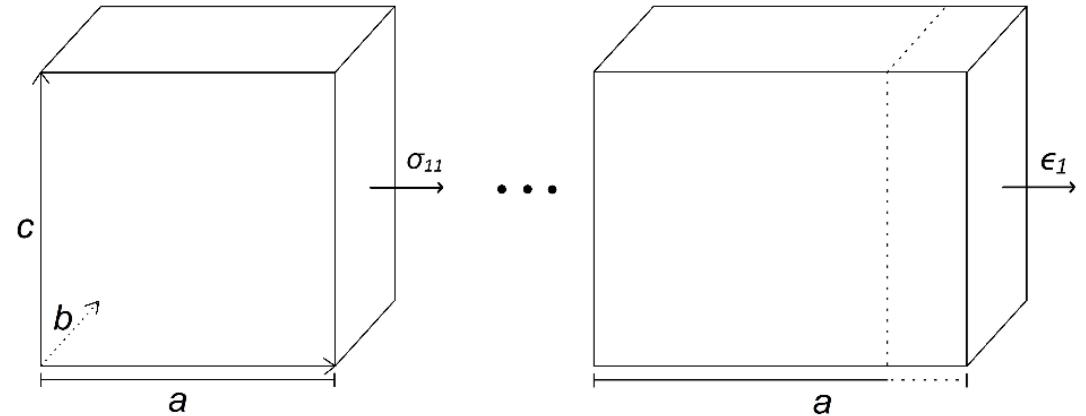
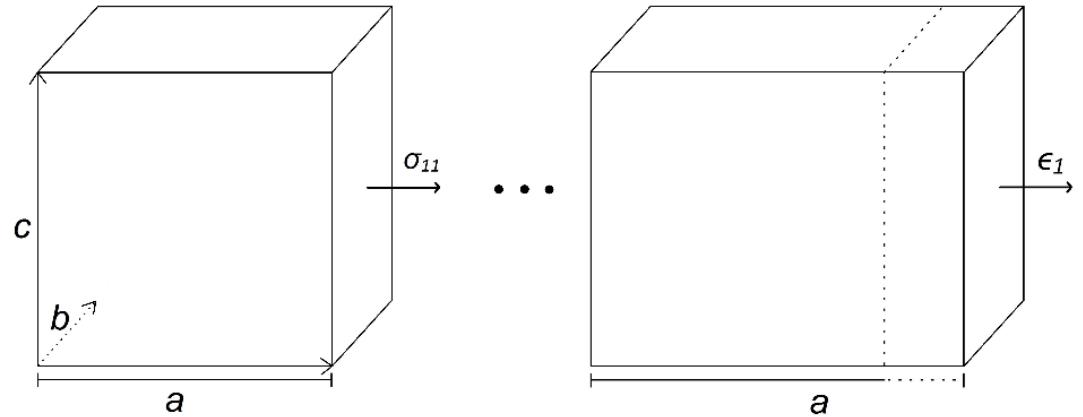


Figure 1. Stress and resulting strain on a cubic lattice.

# Static elasticity calculation

If we apply the strain  $\epsilon_1$

$$\epsilon_1 = \begin{pmatrix} 0.01 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix}$$



**Figure 1. Stress and resulting strain on a cubic lattice.**

After the strain, the lattice parameter become

$$\mathbf{a} = (I + \epsilon_1) \mathbf{a}^0 = \begin{pmatrix} 1.01 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} \begin{pmatrix} a_{11}^0 & 0 & 0 \\ 0 & a_{22}^0 & 0 \\ 0 & 0 & a_{33}^0 \end{pmatrix} = \begin{pmatrix} 1.01 a_{11}^0 & 0 & 0 \\ 0 & a_{22}^0 & 0 \\ 0 & 0 & a_{33}^0 \end{pmatrix}$$

The stress change

$$\sigma_{ij}^0 \rightarrow \sigma_{ij}^0 + \sigma_{ij}$$

Because of the Hooks law

$$\sigma_{ij} = C_{ijkl} \epsilon_{kl} = C_{ijkl} \begin{pmatrix} 0.01 & 0 & 0 \\ 0 & 0 & 0 \\ 0 & 0 & 0 \end{pmatrix}_{kl} = \begin{pmatrix} 0.01 c_{11} & 0.01 c_{16} & 0.01 c_{15} \\ 0.01 c_{16} & 0.01 c_{12} & 0.01 c_{14} \\ 0.01 c_{15} & 0.01 c_{14} & 0.01 c_{13} \end{pmatrix}_{kl}$$

We can calculate elastic coefficient terms  $c_{11}, c_{12}, c_{33}, \dots c_{66}$ .

In practice, we apply a pair of positive and negative strains.

# The SAM-Cij Method (1)

Thermal elastic constants  
are strain derivative of  
free energy

$$c_{ijkl}^T = \frac{1}{V} \left( \frac{\partial^2 F}{\partial e_{ij} \partial e_{kl}} \right) + \frac{P}{2} (2\delta_{ij}\delta_{kl} - \delta_{il}\delta_{kj} - \delta_{ik}\delta_{jl})$$

Under the QHA,  
the vibrational contribution to the Helmholtz free energy is expressed  
as a function of phonon frequencies

$$F(V, T) = U^{\text{st}}(V) + \frac{1}{2} \hbar \omega_{qm}(V) + k_B T \sum_{qm} \ln \left[ 1 - \exp \left[ -\frac{\hbar \omega_{qm}(V)}{k_B T} \right] \right]$$

# The SAM-Cij Method (1)

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Longitudinal and off-diagonal thermal elastic constants  
can be expressed as  
function of strain derivative of  
phonon frequencies

$$\text{where } Q_{qm} = \frac{\hbar \omega_{qm}}{kT}$$

$$c_{iijj}^T(V, T) = c_{iijj}^{\text{st}} + \frac{\hbar}{2V} \sum_{qm} \left( \frac{\partial^2 \omega_{qm}(V)}{\partial e_{ii} \partial e_{jj}} \right) + \frac{k_B T}{V} \sum_{qm} \frac{\partial^2 [\ln(1 - e^{-Q_{qm}})]}{\partial e_{ii} \partial e_{jj}}$$

# The SAM-Cij Method (1)



$$c_{iijj}^T(V, T) = c_{iijj}^{\text{st}} + \frac{\hbar}{2V} \sum_{qm} \left( \frac{\partial^2 \omega_{qm}(V)}{\partial e_{ii} \partial e_{jj}} \right) + \frac{k_B T}{V} \sum_{qm} \frac{\partial^2 [\ln(1 - e^{-Q_{qm}})]}{\partial e_{ii} \partial e_{jj}}$$



$$\gamma_{qm}^{ij} = - \frac{\partial \ln \omega_{qm}}{\partial e_{ij}}$$

The strain derivative of mode frequency  
relates to the strain-Grüneisen parameter

$$= c_{iijj}^{\text{st}} + \frac{\hbar}{2V} \sum_{qm} \left( \gamma_{qm}^{ii} \gamma_{qm}^{jj} - \frac{\partial \gamma_{qm}^{ii}}{\partial e_{jj}} + \delta_{ij} \gamma_{qm}^{ii} \right)$$

$$+ \frac{k_B T}{V} \sum_{qm} \left[ -Q_{qm}^2 \frac{e^{Q_{qm}}}{(e^{Q_{qm}} - 1)^2} \gamma_{qm}^{ii} \gamma_{qm}^{jj} + \frac{Q_{qm}}{(e^{Q_{qm}} - 1)} \left( \gamma_{qm}^{ii} \gamma_{qm}^{jj} - \frac{\partial \gamma_{qm}^{ii}}{\partial e_{jj}} + \gamma_{qm}^{ii} \delta_{ij} \right) \right]$$

$$\text{where } Q_{qm} = \frac{\hbar \omega_{qm}}{kT}$$

## The SAM-Cij Method (2)

$$\bar{\gamma} = \frac{1}{3N} \sum_{qm} \gamma_{qm} = \frac{1}{3N} \sum_{qm} -\frac{\partial \ln \omega_{qm}}{\partial V}$$

↓

anisotropic approximation

$$\overline{\gamma^{ii}} = \frac{1}{3N} \sum_{qm} \gamma_{qm}^{ii} = \frac{1}{3N} \sum_{qm} -\frac{\partial \ln \omega_{qm}}{\partial e_{ii}} = \frac{1}{3} \frac{e_{11} + e_{22} + e_{33}}{e_{ii}} \bar{\gamma}$$

$$\overline{\gamma^{ii}\gamma^{jj}} = \begin{cases} \frac{1}{5} \frac{(e_{11} + e_{22} + e_{33})^2}{e_{ii}e_{jj}} \overline{(\gamma)^2} & \text{if } i = j \\ \frac{1}{15} \frac{(e_{11} + e_{22} + e_{33})^2}{e_{ii}e_{jj}} \overline{(\gamma)^2} & \text{if } i \neq j \end{cases}$$

$$\overline{\frac{\partial \gamma^{ii}}{\partial e_{jj}}} = \begin{cases} \frac{1}{5} \frac{(e_{11} + e_{22} + e_{33})^2}{e_{ii}e_{jj}} V \overline{\frac{\partial \gamma}{\partial V}} & \text{if } i = j \\ \frac{1}{15} \frac{(e_{11} + e_{22} + e_{33})^2}{e_{ii}e_{jj}} V \overline{\frac{\partial \gamma}{\partial V}} & \text{if } i \neq j \end{cases}$$

where  $e_{ii,k} = \frac{a_{i,k+1} - a_{i,k-1}}{(a_{i,k+1} + a_{i,k-1})/2} = \frac{da_{i,k}}{a_{i,k}} = \ln a_{i,k}$

## Review of the SAM-Cij Method (3)

- Some shear and off-diagonal terms ( $c_{ijij}$  and  $c_{ijkl}$ ) are solvable by applying the constraint of strain energy conservation under axis rotation.
- I will not go into details about this.
- General solution are implemented for all crystal systems.
- Demonstrated with good agreement in three examples in different crystal systems here.

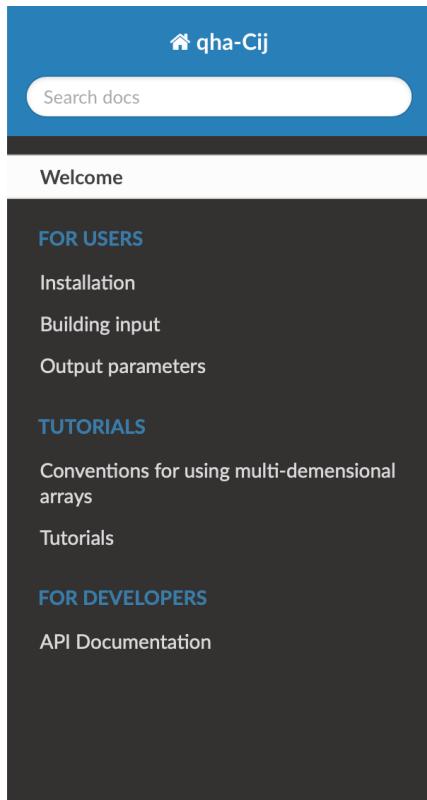
# Usage

# Installation

From GitHub

```
$ pip install cij
```

# Online documentation



[Docs](#) » Welcome to qha-cij's documentation!

[View page source](#)

## Welcome to qha-cij's documentation!

qha-cij is a program that calculates elastic and acoustic properties of minerals at finite temperature.

### For users

- [Installation](#)
- [Building input](#)
- [Output parameters](#)

### Tutorials

- [Conventions for using multi-demensional arrays](#)
- [Tutorials](#)
  - [Plotting elasticity and accoustic velocities at high PT with qha-cij](#)
  - [Checking interpolation of phonon modes](#)
  - [Unit handling and unit conversions in qha-cij](#)
  - [The Voigt notation of strain and elastic modulus](#)

## On GitHub Pages

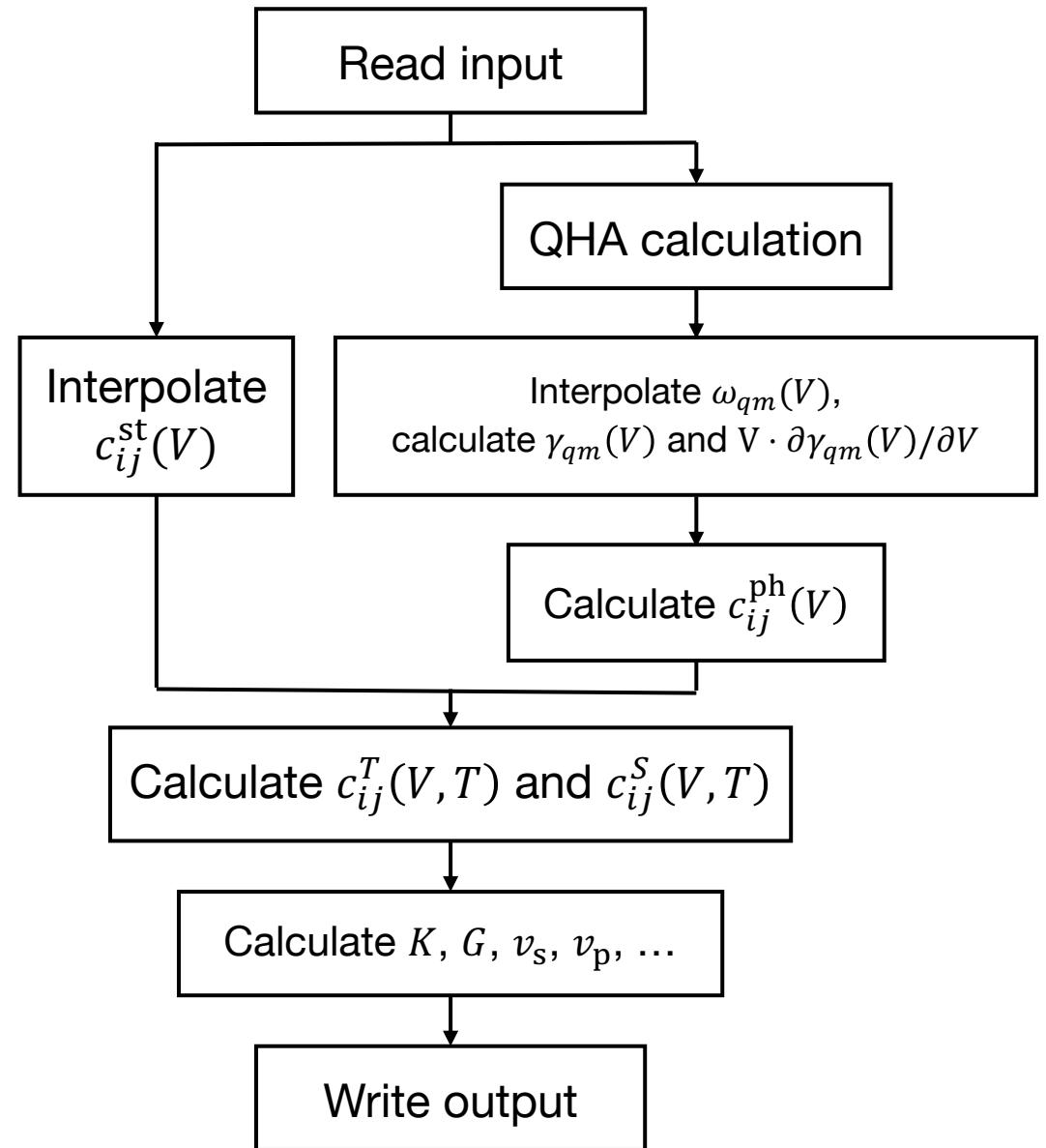
[mineralscloud.github.io/cij/](https://mineralscloud.github.io/cij/)



**To initiate a SAM-Cij calculation:**

```
$ cij run settings.yml
```

## Flowchart: SAM-Cij calculation



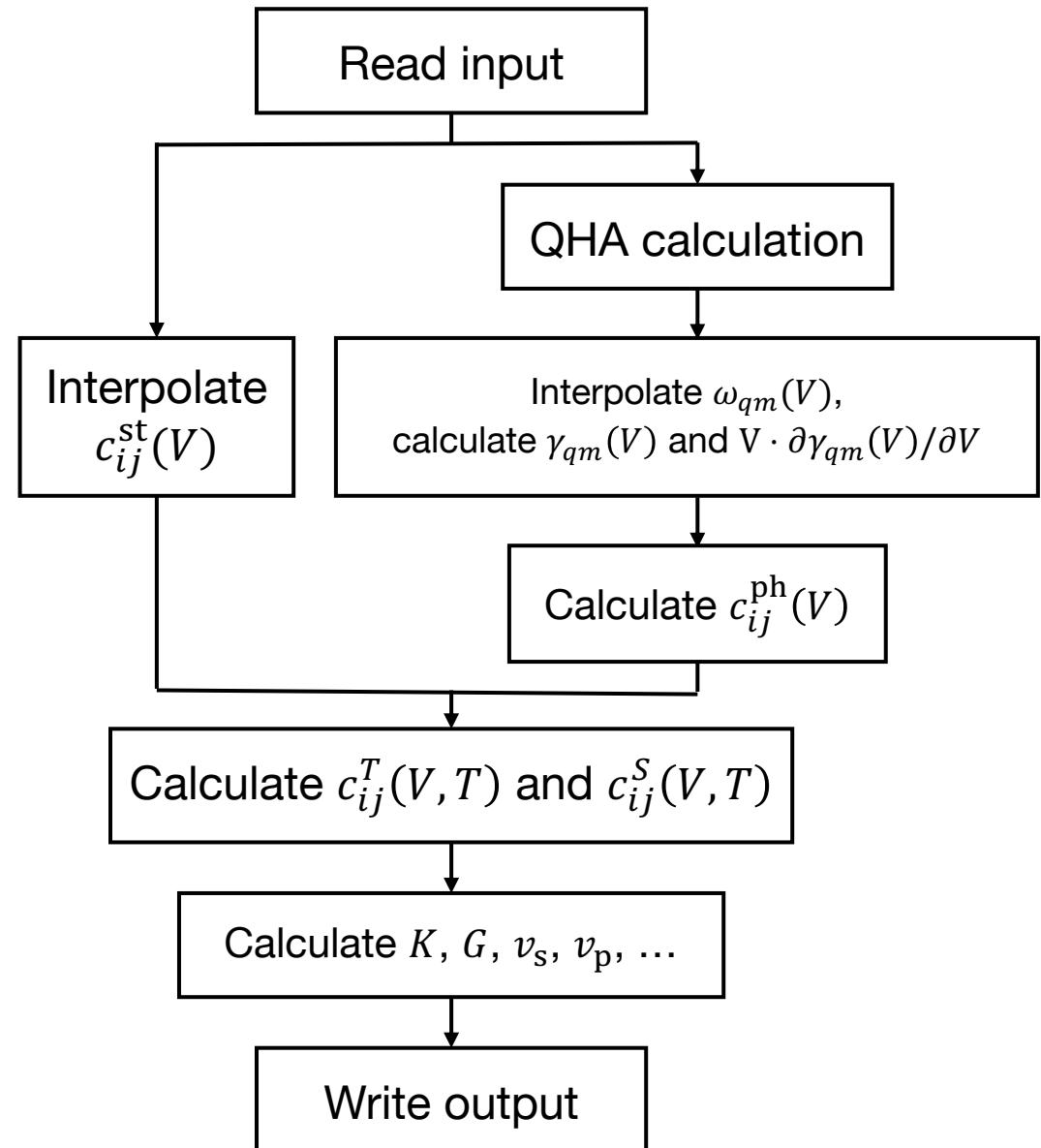
```
$ cij run settings.yml
```

## Usage: Building input files

```
$ ls
```

```
settings.yml      # Calculation settings  
input01           # QHA input data  
elast.dat         # Static Cij data
```

```
$ cij run settings.yml
```



## Usage: Building input files

```
$ ls
```

```
settings.yml # Calculation settings
input01       # QHA input data
elast.dat     # Static Cij data
```

```
$ cij run settings.yml
```

```
qha:
  input: input01
  settings:
    T_MIN: 0
    NT: 21
    DT: 100
    P_MIN: -1
    DELTA_P: 1
    NTV: 15
    order: 3
    volume_ratio: 1.2
elast:
  input: input02
  settings:
    system: trigonal8
    mode_gamma:
      interpolator: spline
      order: 3
  output:
    pressure_base:
      - cij
      - bm_VRH
      - G_VRH
      - v_s
      - v_p
    volume_base:
      - cij
      - ...
```

## Usage: Building input files

```
$ ls
```

```
settings.yml # Calculation settings  
input01       # QHA input data  
elast.dat     # Static Cij data
```

```
$ cij run settings.yml
```

### Structure of the QHA input data

# title ...  
nv nq np nm na

P= P1 V= V1 E= E1  
q<sub>1x</sub> q<sub>1y</sub> q<sub>1z</sub>  
 $\omega_{q_1, m_1}$   
 $\omega_{q_1, m_2}$   
...  
q<sub>2x</sub> q<sub>2y</sub> q<sub>2z</sub>  
 $\omega_{q_2, m_1}$   
...

P= P2 V= V2 E= E2  
q<sub>1x</sub> q<sub>1y</sub> q<sub>1z</sub>  
 $\omega_{q_1, m_1}$   
...

**weights**  
q<sub>1x</sub> q<sub>1y</sub> q<sub>1z</sub> wt<sub>q1</sub>  
q<sub>2x</sub> q<sub>2y</sub> q<sub>2z</sub> wt<sub>q2</sub>  
...

## Usage: Building input files

```
$ ls  
settings.yml # Calculation settings  
input01       # QHA input data  
elast.dat     # Static Cij data
```

```
$ cij run settings.yml
```

### The static Cij input

```
# comment line  
  
V0 N mcell  
V c11 c22 c33 ...  
V1 c11[V1] c22[V1] c33[V1] ...  
V2 c11[V2] c22[V2] c33[V2] ...  
...  
VN c11[VN] c22[VN] c33[VN] ...  
  
lattice_a lattice_b lattice_c  
a1x[V1] a2y[V1] a3z[V1]  
a1x[V2] a2y[V2] a3z[V2]  
...  
a1x[VN] a2y[VN] a3z[VN]
```

## Usage: other tools

\$ **cij**

Usage: cij [OPTIONS] COMMAND [ARGS]...

Commands:

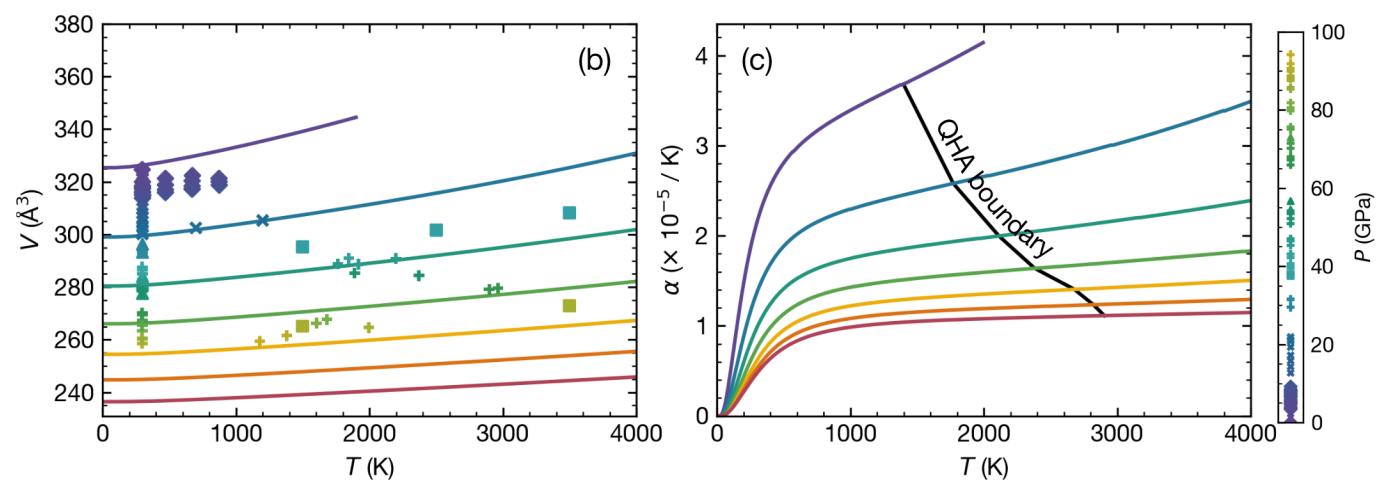
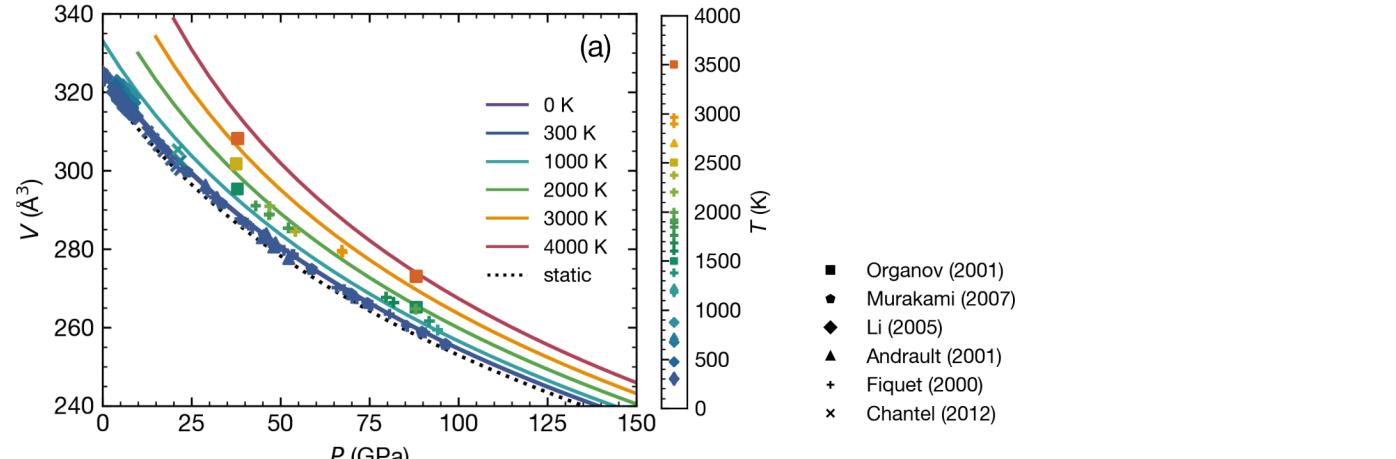
- run** Perform SAM-Cij calculation.
- run-static** Calculate static elastic moduli and acoustic velocities.
- extract** Create data table at specific P or T.
- extract-geotherm** Create data table at geotherm PT (require additional geotherm PT table).
- fill** Fill non-zero Cij terms based on symmetry.
- modes** Plot interpolated mode frequency vs volume.
- plot** Plot SAM-Cij calculation results.

Calculation details  
LDA + DFPT phonon  
Quantum ESPRESSO

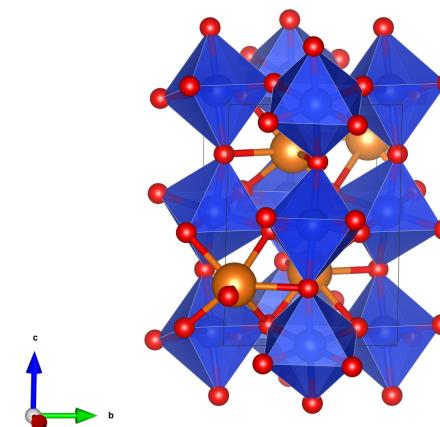
# Examples

- $\text{MgSiO}_3$  bridgmanite (orthorhombic)
- $\text{MgCaSi}_2\text{O}_6$  diopside (monoclinic)
- $\text{MgSiO}_3$  akimotoite (trigonal)

# Example (1): $\text{MgSiO}_3$ bridgemanite (orthorhombic)



EoS and Thermoexpansivity



Space group:  $Pbmn$

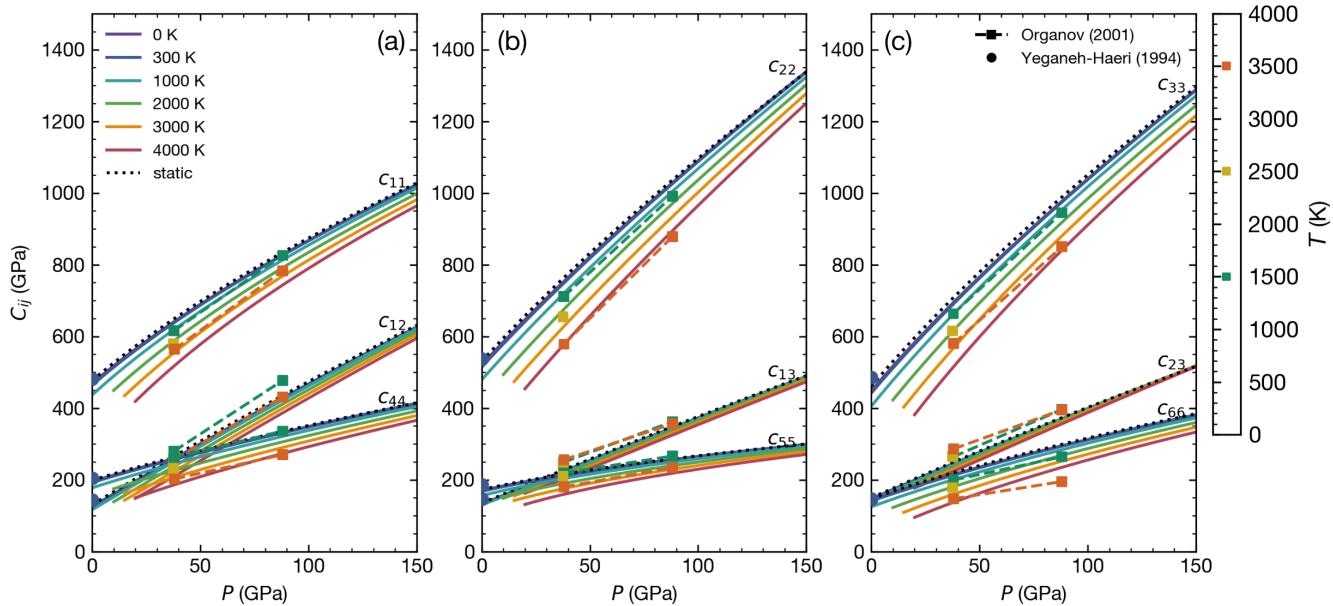
Number of atoms: 40 (8 f.u., supercell)

Exchange-correlation functionals: LDA

Pseudopotential:

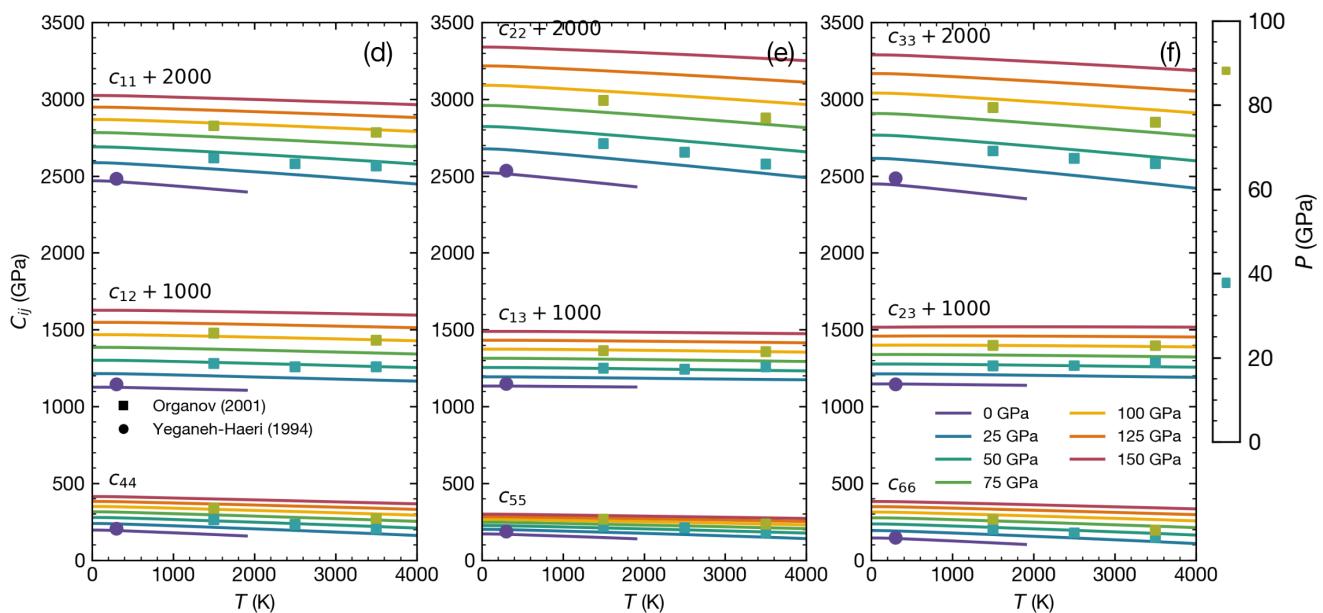
- Mg: norm-conserving
- Si, O: ultrasoft

# Example (1): $\text{MgSiO}_3$ bridgmanite (orthorhombic)

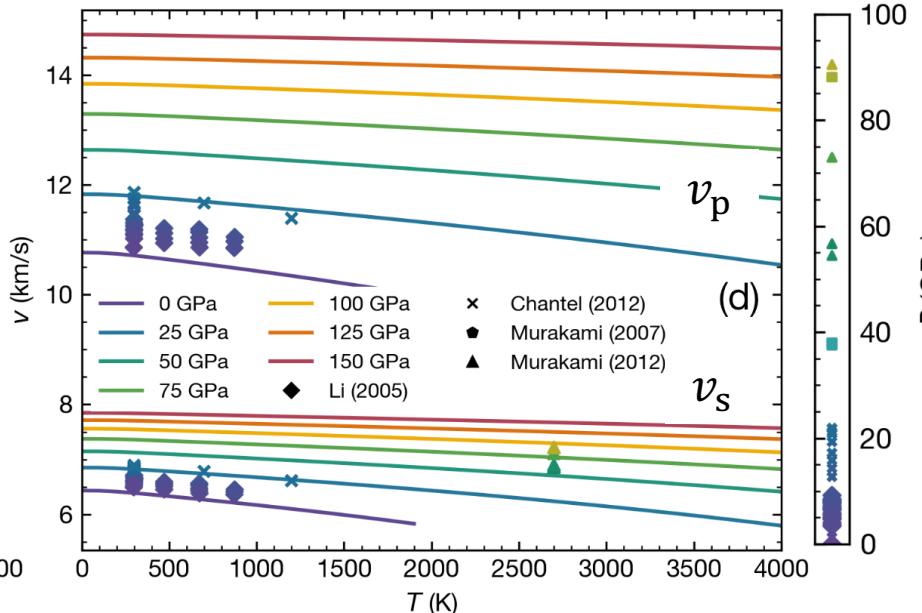
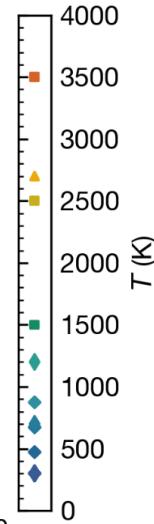
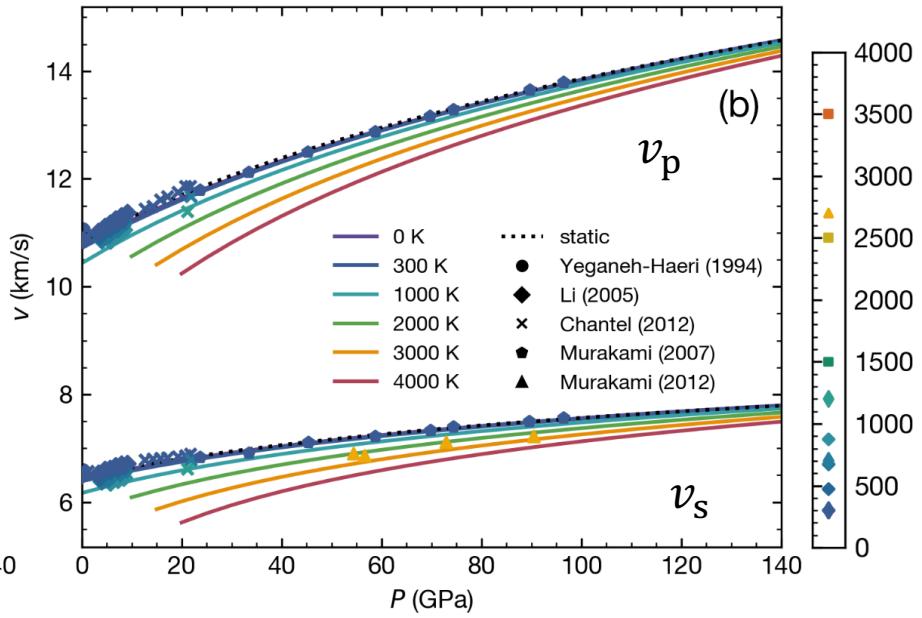
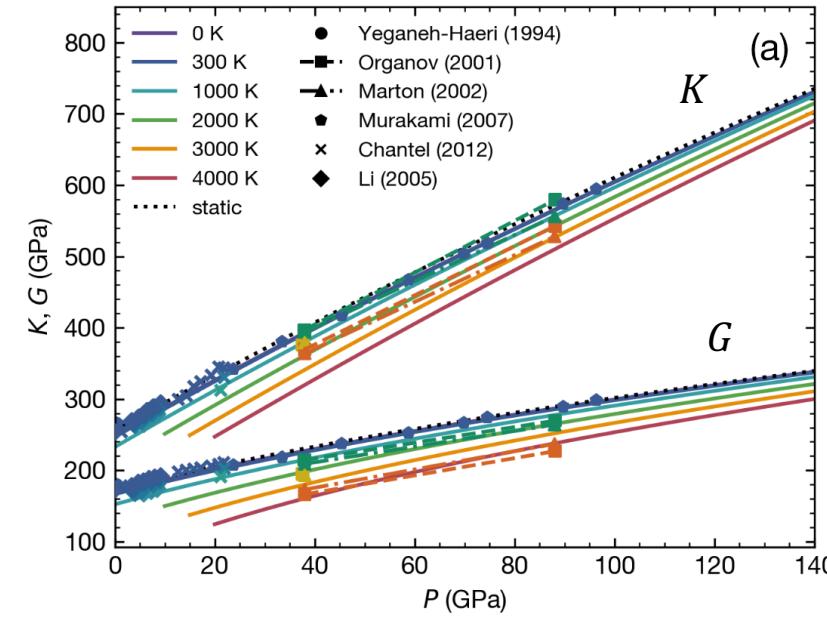


$$C_{\text{ortho}} = \begin{pmatrix} C_{11} & C_{12} & C_{13} \\ C_{12} & C_{22} & C_{23} \\ C_{13} & C_{23} & C_{33} \\ \vdots & \vdots & \vdots \\ C_{44} & & & \\ & C_{55} & & \\ & & C_{66} & \end{pmatrix}.$$

9 independent  $c_{ij}$



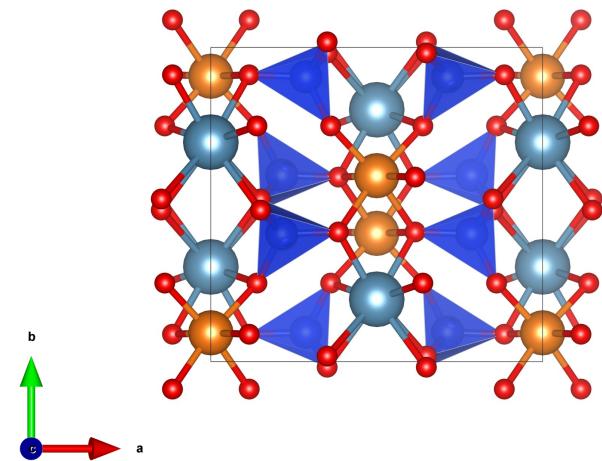
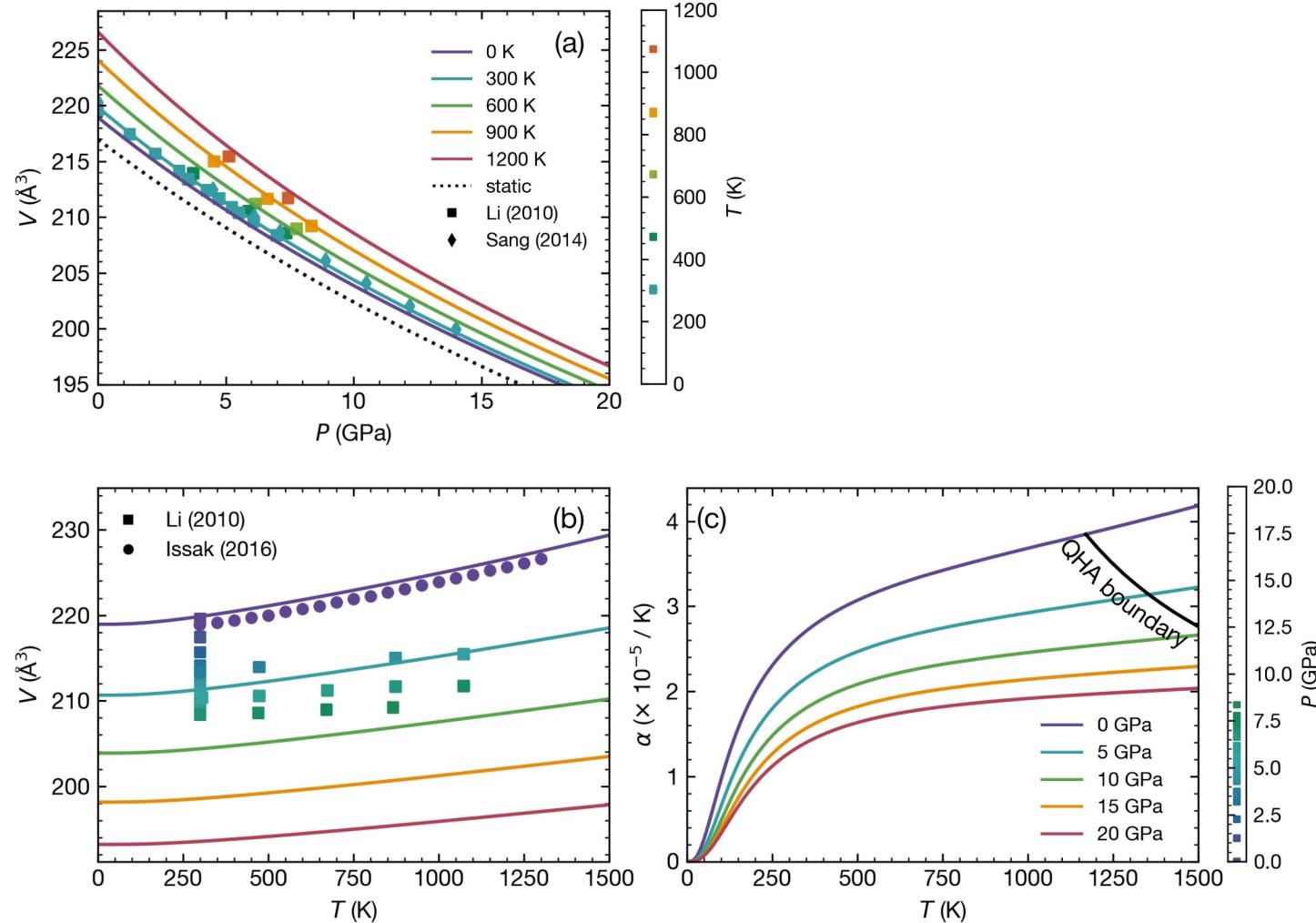
# Example (1): $\text{MgSiO}_3$ bridgmanite (orthorhombic)



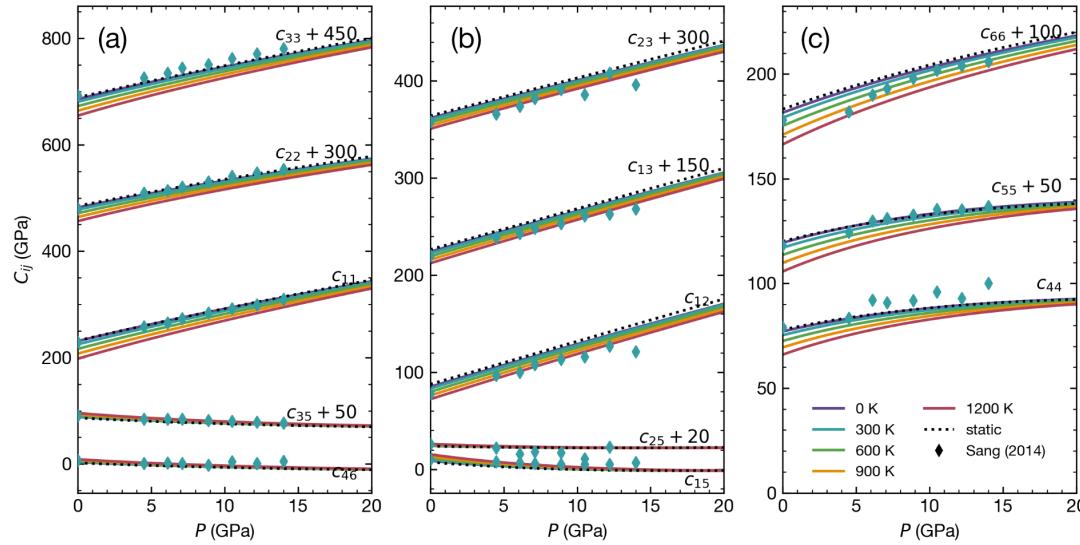
$$v_s = \sqrt{G/\rho}$$

$$v_p = \sqrt{\frac{K + 3/4G}{\rho}}$$

## Example (2): MgCaSi<sub>2</sub>O<sub>6</sub> diopside (monoclinic)

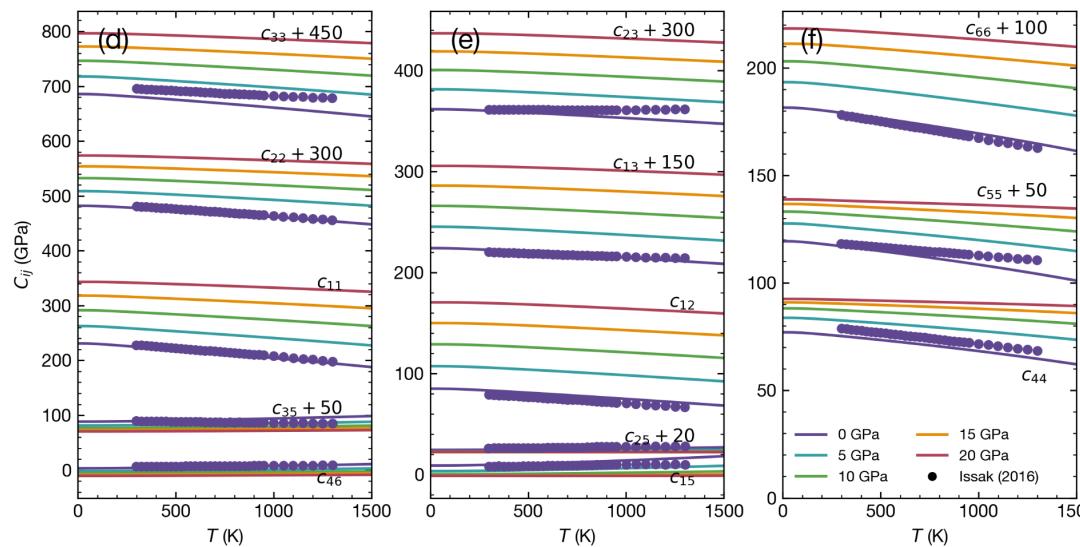


## Example (2): $\text{MgCaSi}_2\text{O}_6$ diopside (monoclinic)

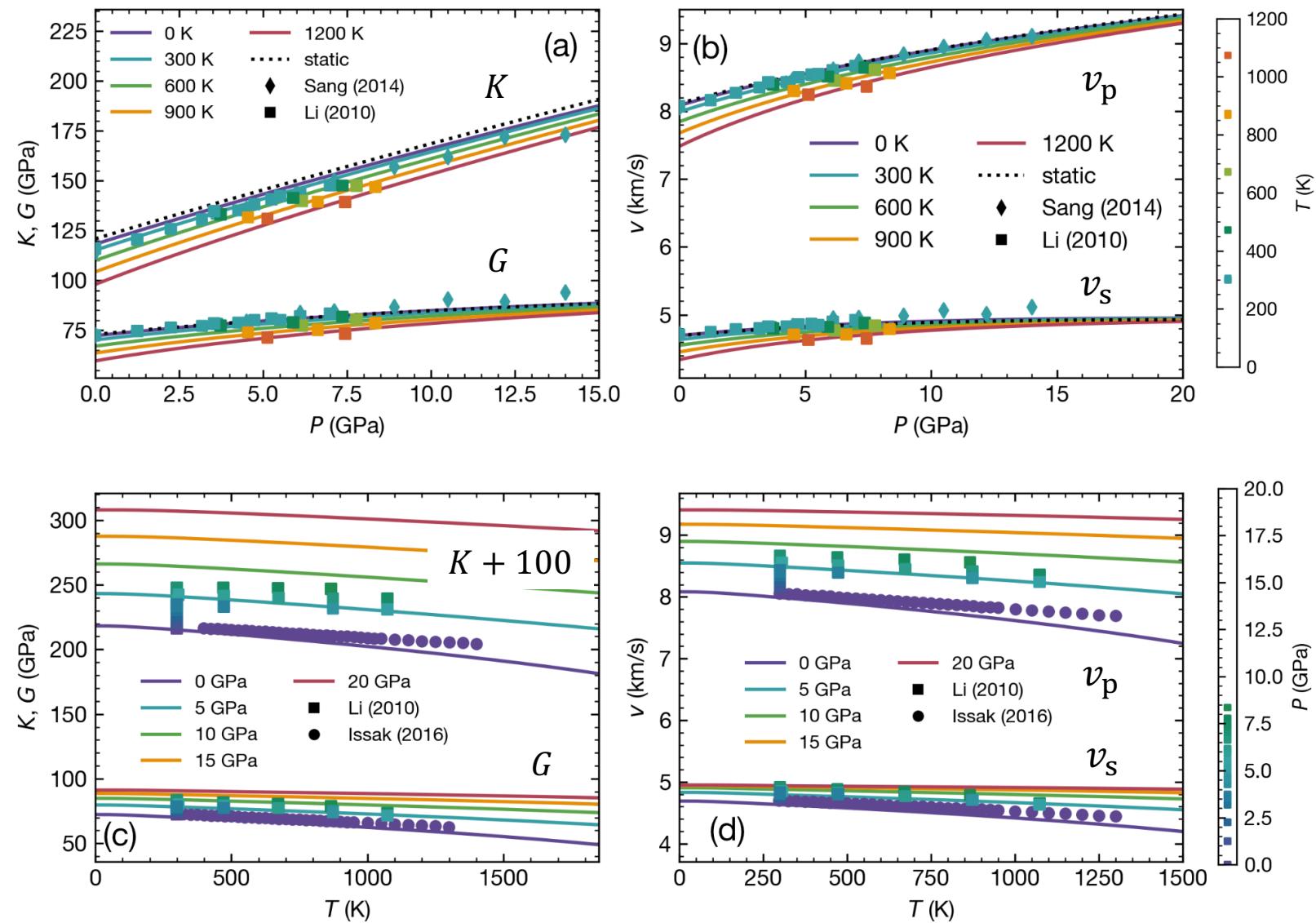


$$C_{ij} = \begin{bmatrix} C_{11} & C_{12} & C_{13} & 0 & C_{15} & 0 \\ C_{12} & C_{22} & C_{23} & 0 & C_{25} & 0 \\ C_{13} & C_{23} & C_{33} & 0 & C_{35} & 0 \\ 0 & 0 & 0 & C_{44} & 0 & C_{46} \\ C_{15} & C_{25} & C_{35} & 0 & C_{55} & 0 \\ 0 & 0 & 0 & C_{46} & 0 & C_{66} \end{bmatrix}$$

13 independent  $c_{ij}$



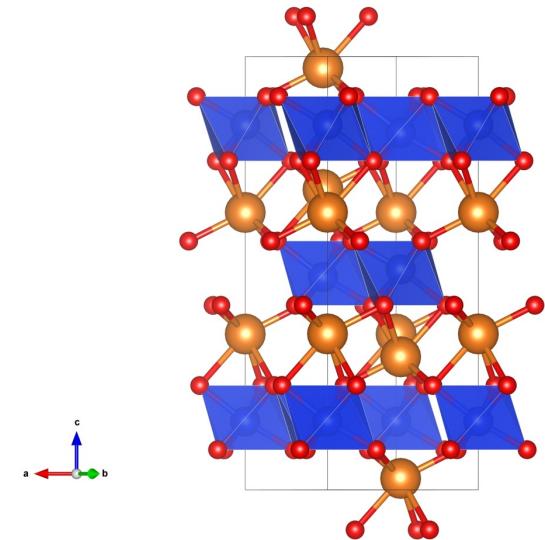
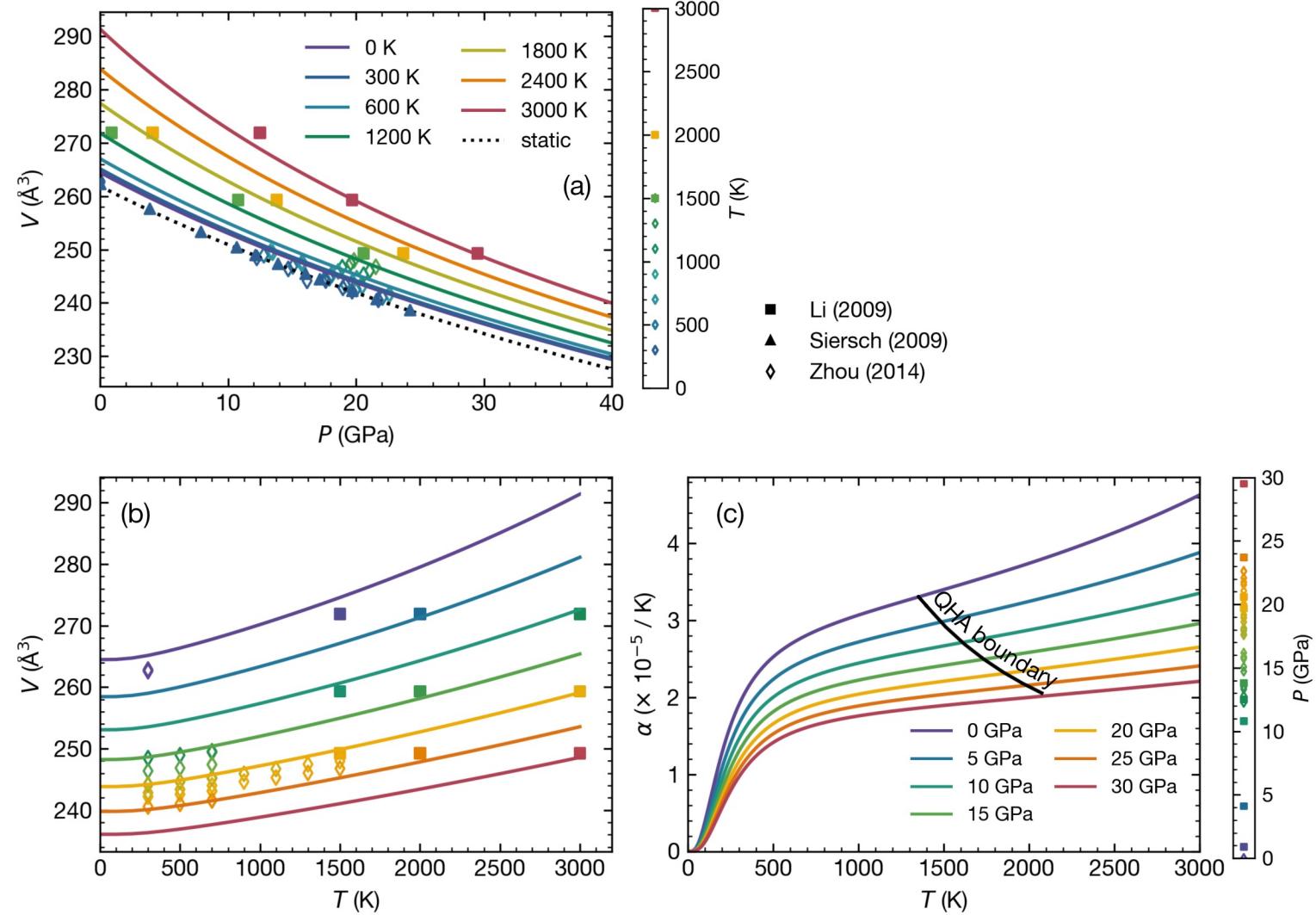
## Example (2): $\text{MgCaSi}_2\text{O}_6$ diopside (monoclinic)



$$v_s = \sqrt{G/\rho}$$

$$v_p = \sqrt{\frac{K + 3/4G}{\rho}}$$

## Example (3): MgSiO<sub>3</sub> akimotoite (trigonal)



Space group:  $R\bar{3}$

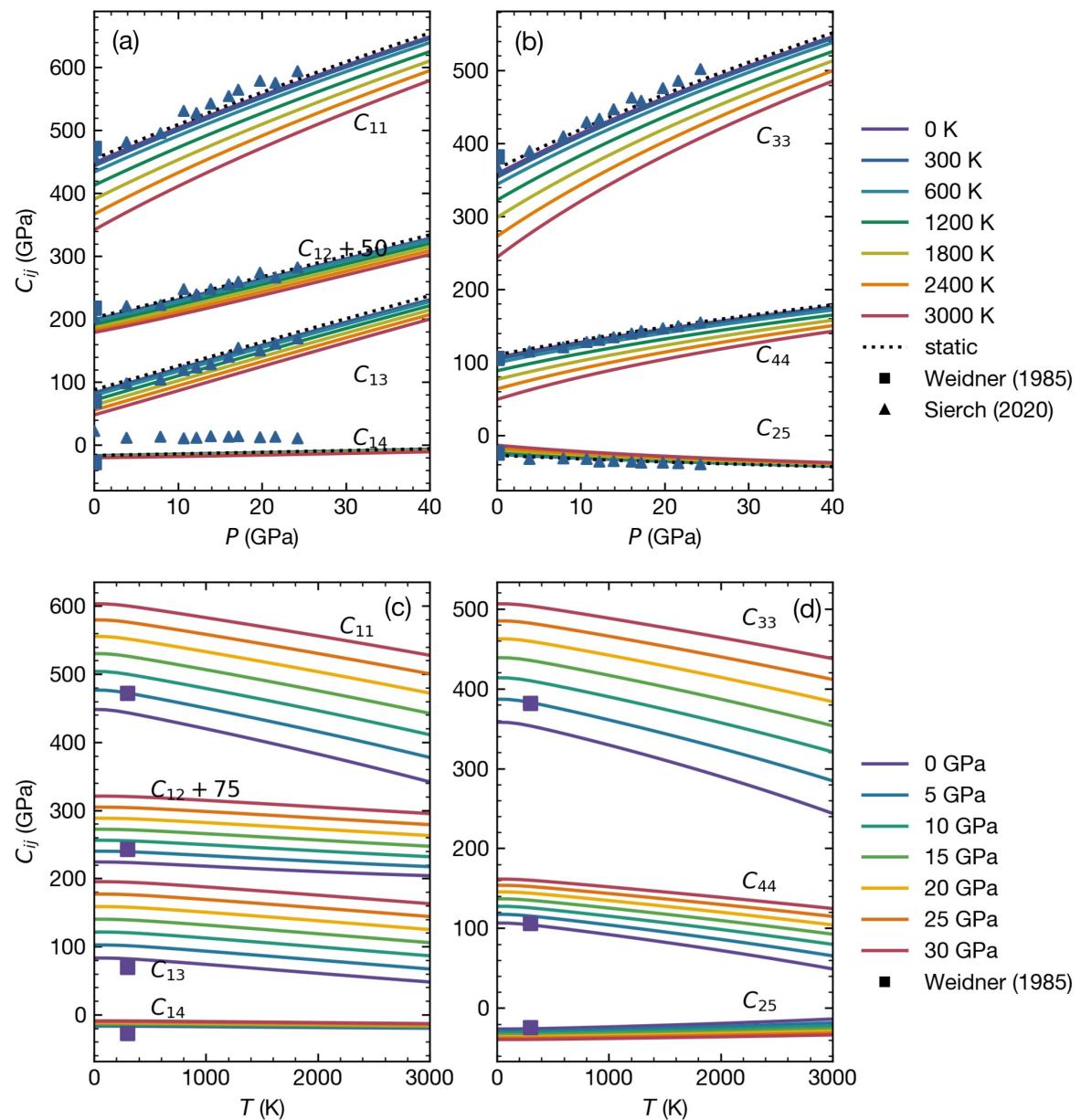
Number of atoms: 30 (6 f.u.)

Exchange-correlation functionals: LDA

Pseudopotential:

- Mg, Si, O: norm-conserving

## Example (3): MgSiO<sub>3</sub> akimotoite (trigonal)

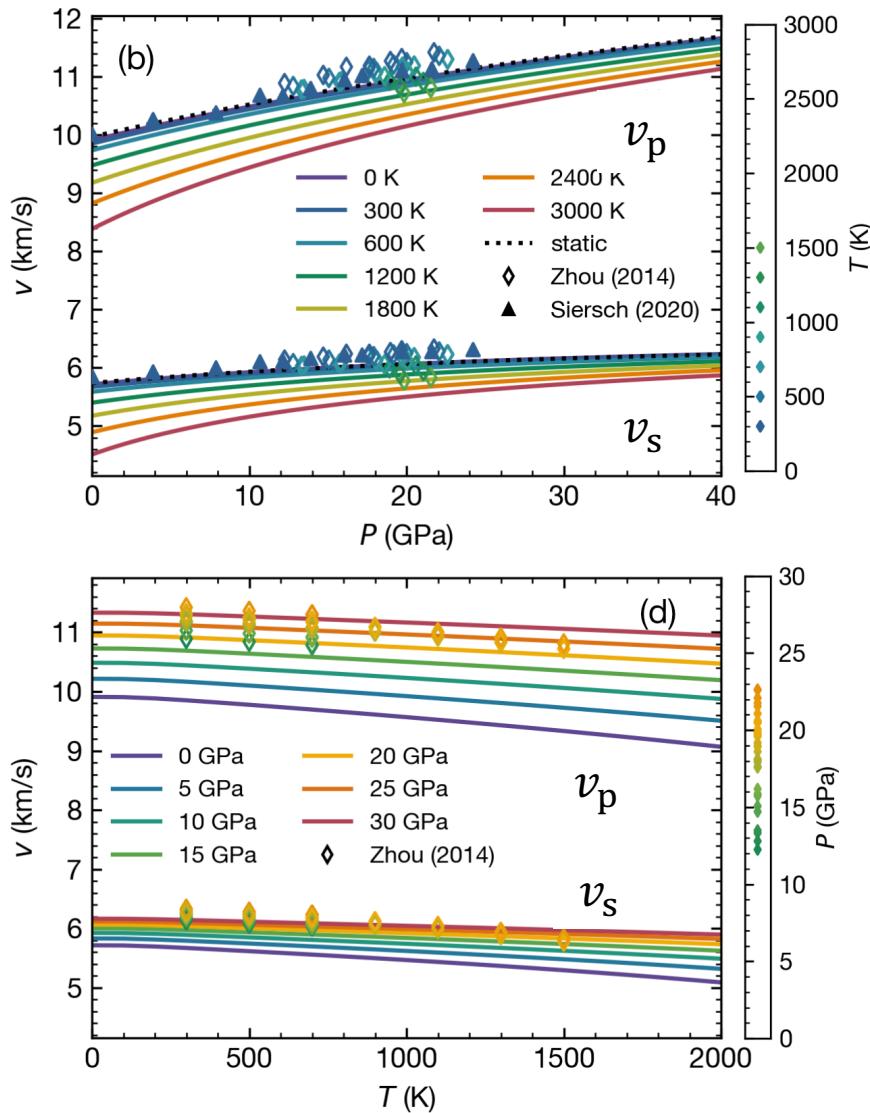
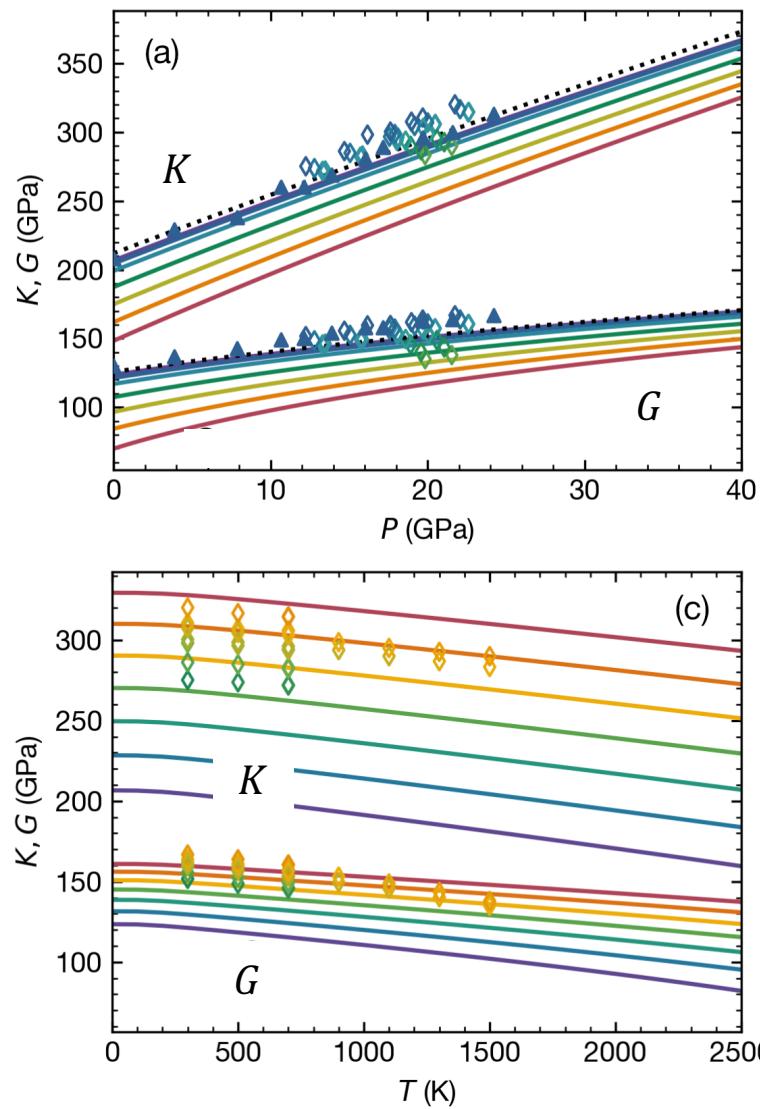


$R\bar{3}$

$c_{ij} = \begin{bmatrix} c_{11} & c_{12} & c_{13} & c_{14} & -c_{25} & 0 \\ c_{11} & c_{13} & -c_{14} & c_{25} & 0 & 0 \\ c_{33} & 0 & 0 & 0 & 0 & 0 \\ c_{44} & 0 & 0 & c_{44} & 0 & 2c_{15} \\ c_{44} & 0 & 0 & c_{44} & 2c_{14} & (c_{11}-c_{22})/2 \end{bmatrix}$

7 independent  $c_{ij}$

## Example (3): MgSiO<sub>3</sub> akimotoite (trigonal)



$$v_s = \sqrt{G/\rho}$$

$$v_p = \sqrt{\frac{K + 3/4G}{\rho}}$$



## Conclusion

We introduce a new Python package, `cij`, that calculates the thermoelastic tensor and acoustic velocities of solids vs  $PT$ .

The code implements the SAM-Cij method and has been successfully tested on many systems with different symmetries.



Cij paper on **arXiv**  
[arxiv.org/abs/  
2101.12596](https://arxiv.org/abs/2101.12596)



Cij code on **GitHub**  
[github.com/  
mineralscloud/cij](https://github.com/mineralscloud/cij)



# Phonon frequency ordering according to eigenvectors

Assume no degeneracy, at reciprocal coordinate  $\mathbf{q}$ ,  $\omega_{\mathbf{q}m}^2$  and  $\mathbf{e}_{\mathbf{q}m}$  are the  $m$ -th eigenvalue and eigenvector of the dynamical matrix  $D(\mathbf{q})$  (Srivastava, 1990),



$$D(\mathbf{q}) \mathbf{e}_{\mathbf{q}m} = \omega_{\mathbf{q}m}^2 \mathbf{e}_{\mathbf{q}m}$$

The orthonormality in the set of normal modes  $\mathbf{e}_{\mathbf{q}m}$  is given by

$$\mathbf{e}_{\mathbf{q}m}^\dagger \mathbf{e}_{\mathbf{q}m'} = \delta_{mm'} .$$

For crystal under two compression state  $V$  and  $V + dV$  ( $dV \ll V$ ),

$$\mathbf{e}_{\mathbf{q}m}^\dagger(V) \mathbf{e}_{\mathbf{q}m'}(V + dV) = \delta_{mm'} + \epsilon_{mm'}(V, dV)$$

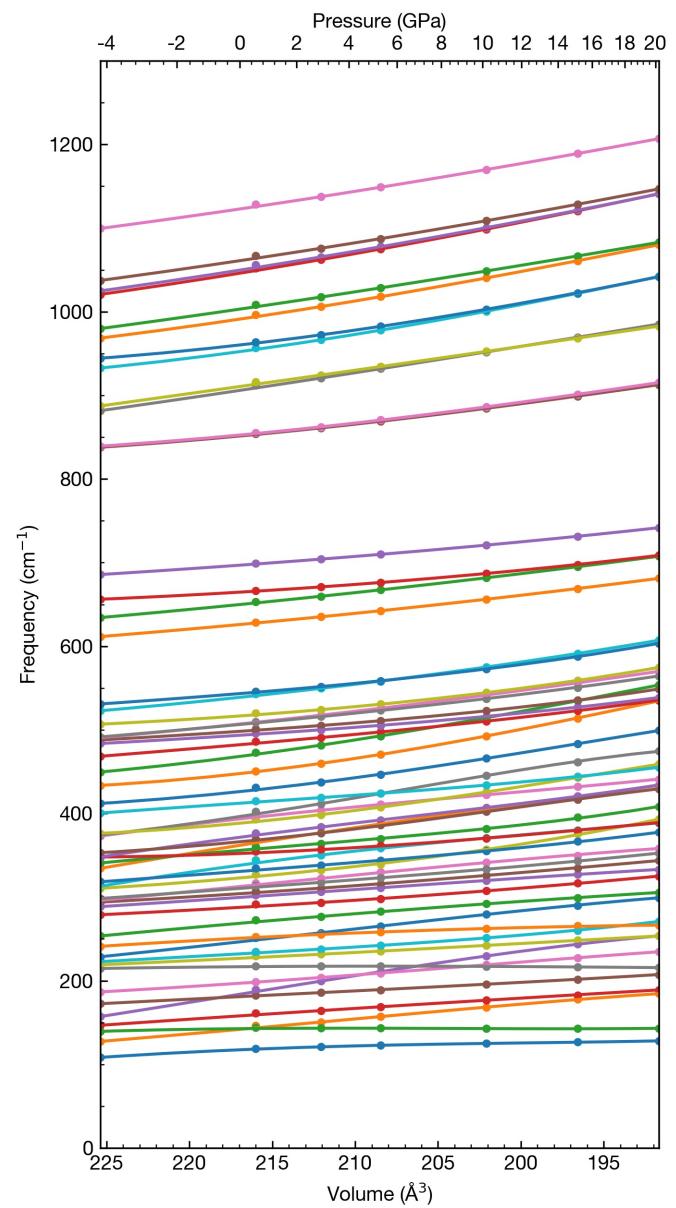
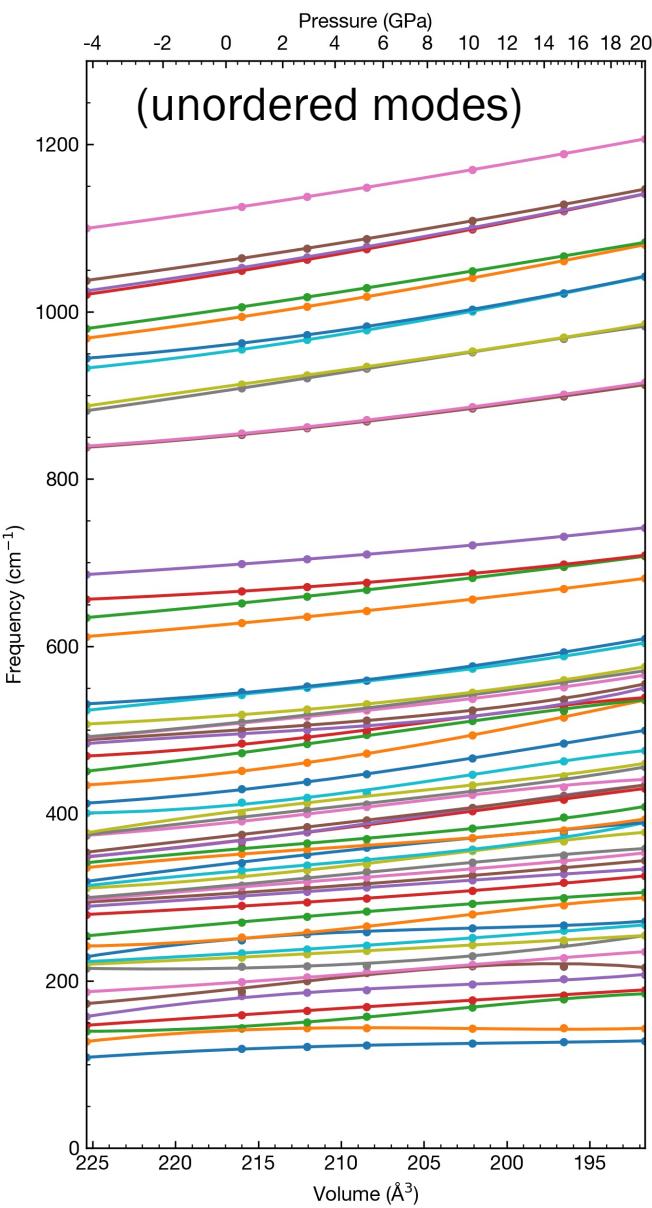
$\epsilon$  is a small number.

In practice, we are able to reorder  $\omega_{\mathbf{q}m}$  based on  $\mathbf{e}_{\mathbf{q}m}$  by calculating  $\mathbf{e}_{\mathbf{q}m}^\dagger(V) \mathbf{e}_{\mathbf{q}m'}(V + dV)$  and connect  $m$  and  $m'$ .



# Phonon $\omega$ vs V

- Zone center,  $\Gamma$  point
- $N = 20$  atoms, therefore  
 $3N - 3 = 57$  modes in total.



# Phonon $\omega$ vs V

