

PyCrystalField tutorial

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Modeling and Fitting Crystal Fields With Neutron Scattering
Virtual Workshop
May 4, 2022

Outline

- Part 1: generate a point charge model from a .cif file.
- Part 2: fit a CEF Hamiltonian to neutron scattering data.
- Part 3: Calculate bulk magnetization and susceptibility.

Installation notes:

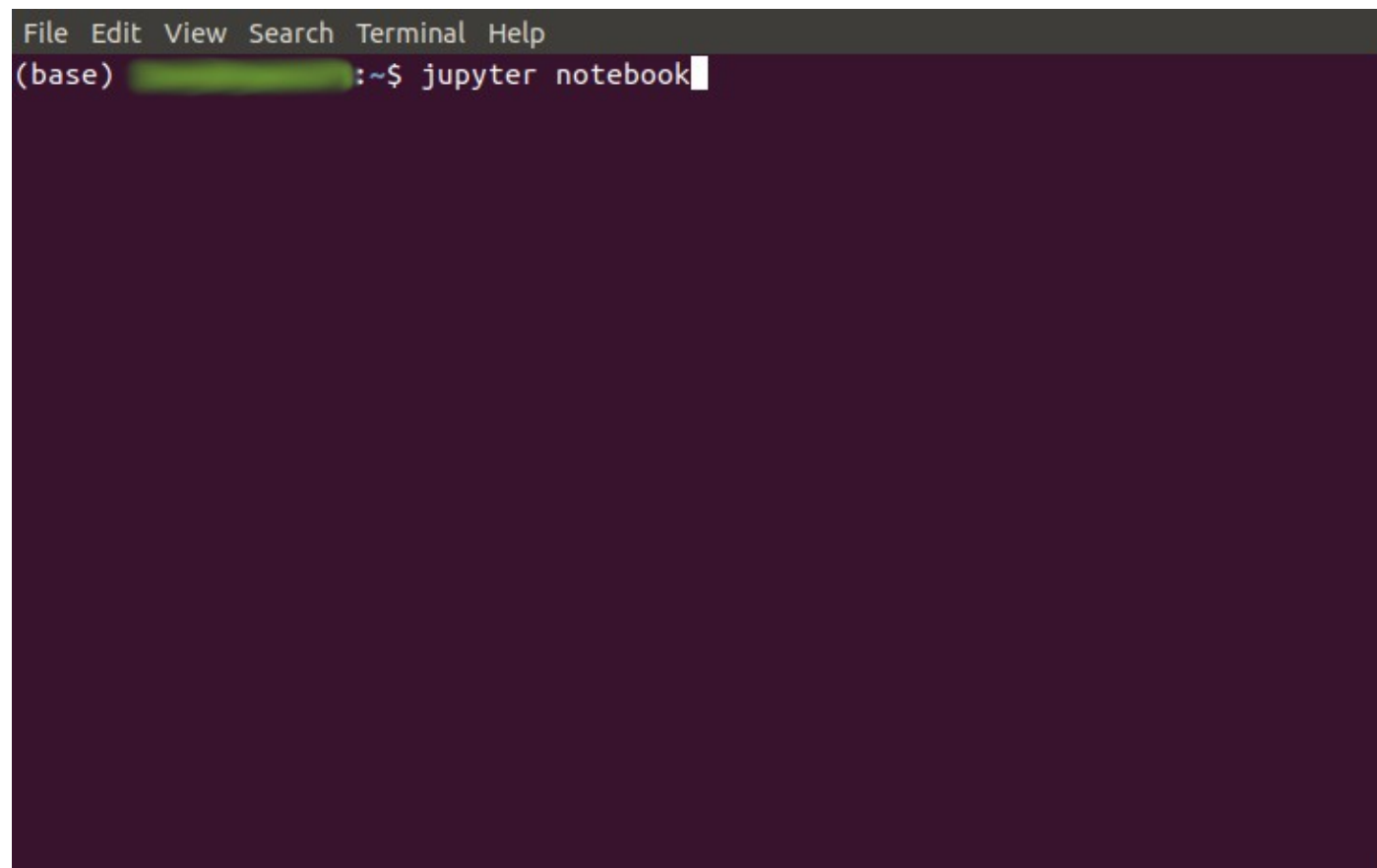
- PyCrystalField is designed to be used with Jupyter notebooks
 - Easiest way to install: Anaconda <https://www.anaconda.com/>
 - Anaconda also includes all required dependencies.
- Next, install using pip:

To download and use PyCrystalField, run the following command in a prompt/terminal window:

```
pip install git+https://github.com/asche1/PyCrystalField.git@master
```

Part 1: Import a .cif and calculate a point charge model

Open Jupyter notebook: run the following in a prompt/terminal window:

A terminal window with a dark background and a light-colored menu bar at the top containing 'File', 'Edit', 'View', 'Search', 'Terminal', and 'Help'. The terminal prompt is '(base) ~\$' followed by the command 'jupyter notebook' and a cursor. The rest of the terminal area is empty.

```
File Edit View Search Terminal Help
(base) ~$ jupyter notebook
```

Then, navigate to the PCF_tutorial/Part1 and open BlankNotebook.ipynb

Open Jupyter notebook: run the following in a prompt/terminal window:



Then, navigate to the PCF_tutorial/Part1 and open BlankNotebook.ipynb

First things first: import the libraries

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
```

First things first: import the libraries

numerics and
plotting libraries

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
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```

PyCrystalField

Next, use PycrystalField to import a .cif file

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig, Yb = cef.importCIF('Yb2Ti207.cif')
```

Line 7, Column 43

Tab Size: 4

Python

Next, use PycrystalField to import a .cif file

ImportCIF output:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig Yb = cef.importCIF('Yb2Ti207.cif')
```

“Ligands” object

Used for point charge calculations

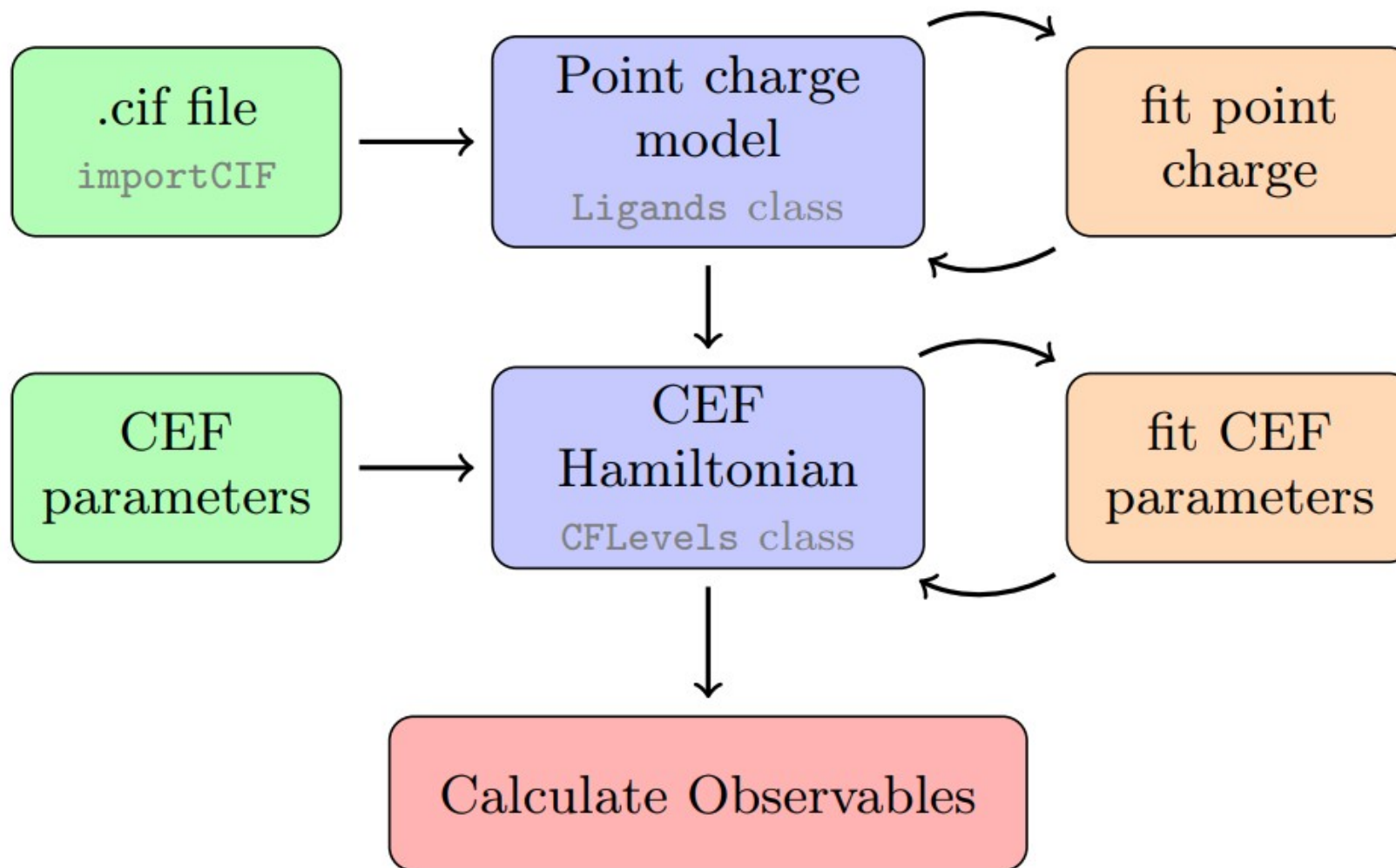
“CFLevels” object

Used for diagonalizing CEF Hamiltonians and calculating observables

ImportCIF input:

- .cif file
- Magnetic ion
(automatically picks the first rare earth ion if none specified)
- Number of neighbors
(optional)
- ...

Relationship between Ligands and CFLevels objects:



Running the code as is:

- imports the .cif file
- identifies the nearest neighbor ligand
- Builds a ligand shell
- Calculates the highest symmetry direction to put the z axis (in this case, along a 3-fold axis)
 - *Note: if symmetry is very low, PyCrystalField calculates near-symmetries using continuous shape measures to assign axes.*

Stevens operators from a point charge model

```
File Edit View Search Terminal Help
(base) ~/Documents/Conferences/2022_CrystalFields/PCF_tutorial/Par
t1$ python YTO.py
*****
*                               PyCrystalField 2.3.3                               *
* Please cite J. Appl. Cryst. (2021). 54, 356-362 *
* <https://doi.org/10.1107/S160057672001554X> *
*****

Importing atoms
104 atoms added
.cif import complete.
No mag_ion ion listed, assuming Yb1 is the central ion.
Central ion: Yb3+ at [0.5, 0.5, 0.5]
  AAAH! There is a super-close atom. Removing it...
Nearest ligand: O2-
  Identified 8 O2- ligands.
  Found 3 fold axis about [1. 1. 1.]
  Found mirror plane: [-0.70710678  0.          0.70710678]

Axes for point charge model (in ABC space):
  X axis = [-0.5  1. -0.5]
  Y axis = [-1.  0.  1.]
  Z axis = [1.  1.  1.]

Creating a point charge model...
B_2 0 = 0.53552196
B_2 1 = -0.0
B_2 2 = -0.0
B_4 0 = -0.04430884
B_4 1 = 0.0
B_4 2 = -0.0
B_4 3 = 0.33472584
B_4 4 = -0.0
B_6 0 = 0.00032957
B_6 1 = -0.0
B_6 2 = -0.0
B_6 3 = 0.00302494
B_6 4 = -0.0
B_6 5 = -0.0
B_6 6 = 0.00313667
(base) ~/Documents/Conferences/2022_CrystalFields/PCF_tutorial/Par
t1$
```

Now, let's calculate the eigenvectors and eigenvalues:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig, Yb = cef.importCIF('Yb2Ti207.cif')
8
9 ##### print eigenvectors
10
11 Yb.printEigenvectors()
```

Line 11, Column 23

Tab Size: 4

Python

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```

Output:

- level energies
- Eigenvectors

File Edit View Search Terminal Help

```
B_6 3 = 0.00302494
B_6 4 = -0.0
B_6 5 = -0.0
B_6 6 = 0.00313667
```

Eigenvalues

Eigenvectors

| | | | |
|----------|--|---------------------------------------|--|
| 0.00000 | | [-0.374 0. 0. -0.921 0. 0. 0.105 0.] | |
| 0.00000 | | [0. 0.105 0. 0. 0.921 0. 0. -0.374] | |
| 38.61543 | | [0. 0.001 0. 0. -0.376 0. 0. -0.926] | |
| 38.61543 | | [-0.926 0. 0. 0.376 0. 0. 0.001 0.] | |
| 47.10950 | | [0. 0. 0.218 0. 0. -0.976 0. 0.] | |
| 47.10950 | | [0. 0. 0.976 0. 0. 0.218 0. 0.] | |
| 75.14028 | | [0.04 0. 0. 0.097 0. 0. 0.994 0.] | |
| 75.14028 | | [0. 0.994 0. 0. -0.097 0. 0. 0.04] | |

(base) ~/Documents/Conferences/2022_CrystalFields/PCF_tutorial/Part1\$

Line 11, Column 23

Tab Size: 4

Python

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11 Yb.printEigenvectors()
```

Output:

- level energies
- Eigenvectors

File Edit View Search Terminal Help

```
B_6 3 = 0.00302494
B_6 4 = -0.0
B_6 5 = -0.0
B_6 6 = 0.003130
```

Yb³⁺ is a J=7/2 ion, so the matrix shows

$m_j = -7/2, m_j = -5/2, m_j = -3/2, m_j = -1/2, m_j = 1/2, m_j = 3/2, m_j = 5/2, m_j = 7/2$

Eigenvalues

Eigenvectors

| | | | |
|----------|--|---------------------------------------|--|
| 0.00000 | | [-0.374 0. 0. -0.921 0. 0. 0.105 0.] | |
| 0.00000 | | [0. 0.105 0. 0. 0.921 0. 0. -0.374] | |
| 38.61543 | | [0. 0.001 0. 0. -0.376 0. 0. -0.926] | |
| 38.61543 | | [-0.926 0. 0. 0.376 0. 0. 0.001 0.] | |
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| 75.14028 | | [0. 0.994 0. 0. -0.097 0. 0. 0.04] | |

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Python

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- level energies
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Eigenvalues

Eigenvectors

| | |
|----------|--|
| 0.00000 | [-0.374 0. 0. -0.921 0. 0. 0.105 0.] |
| 0.00000 | [0. 0.105 0. 0. 0.921 0. 0. -0.374] |
| 38.61543 | [0. 0.001 0. 0. -0.376 0. 0. -0.926] |
| 38.61543 | [-0.926 0. 0. 0.376 0. 0. 0.001 0.] |
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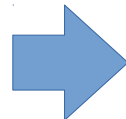
(base) :~/Documents/Conferences/2022_CrystalFields/PCF_tutorial/Part1\$

What this tells us:

1. The ground state doublet is ~40 meV separated from the first excited state
2. The ground state doublet is dominated by $m_j = \pm 1/2$

Side-note: the command `printLaTexEigenvectors` outputs a LaTeX readable table:

```
Yb.printLaTexEigenvectors()
```



```
File Edit View Search Terminal Help
\begin{table*}
\caption{Eigenvectors and Eigenvalues...}
\begin{ruledtabular}
\begin{tabular}{c|ccccccc}
E (meV) &  $|\frac{7}{2}\rangle$  &  $|\frac{5}{2}\rangle$  &  $|\frac{3}{2}\rangle$  &  $|\frac{1}{2}\rangle$  &  $|\frac{3}{2}\rangle$  &  $|\frac{5}{2}\rangle$  &  $|\frac{7}{2}\rangle$  \\
\hline
0.000 & -0.3742 & 0.0 & 0.0 & -0.9214 & 0.0 & 0.0 & 0.1053 \\
0.000 & 0.0 & 0.1053 & 0.0 & 0.0 & 0.9214 & 0.0 & -0.3742 \\
38.615 & 0.0 & 0.0008 & 0.0 & 0.0 & -0.3764 & 0.0 & -0.9265 \\
38.615 & -0.9265 & 0.0 & 0.0 & 0.3764 & 0.0 & 0.0 & 0.0008 \\
47.109 & 0.0 & 0.0 & 0.2183 & 0.0 & 0.0 & -0.9759 & 0.0 \\
47.109 & 0.0 & 0.0 & 0.9759 & 0.0 & 0.0 & 0.2183 & 0.0 \\
75.140 & 0.0404 & 0.0 & 0.0 & 0.0972 & 0.0 & 0.0 & 0.9944 \\
75.140 & 0.0 & 0.9944 & 0.0 & 0.0 & -0.0972 & 0.0 & 0.0404 \\
\end{tabular}
\end{ruledtabular}
\label{flo:Eigenvectors}
\end{table*}
(base) 101@lap113771:~/Documents/Conferences/2022_CrystalFields/PCF_tutorial/Part1$
```



Render with LaTeX...

Table I. Eigenvectors and Eigenvalues...

| E (meV) | $ \frac{7}{2}\rangle$ | $ \frac{5}{2}\rangle$ | $ \frac{3}{2}\rangle$ | $ \frac{1}{2}\rangle$ | $ \frac{3}{2}\rangle$ | $ \frac{5}{2}\rangle$ | $ \frac{7}{2}\rangle$ |
|---------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|-----------------------|
| 0.000 | -0.3742 | 0.0 | 0.0 | -0.9214 | 0.0 | 0.0 | 0.1053 |
| 0.000 | 0.0 | 0.1053 | 0.0 | 0.0 | 0.9214 | 0.0 | -0.3742 |
| 38.615 | 0.0 | 0.0008 | 0.0 | 0.0 | -0.3764 | 0.0 | -0.9265 |
| 38.615 | -0.9265 | 0.0 | 0.0 | 0.3764 | 0.0 | 0.0 | 0.0008 |
| 47.109 | 0.0 | 0.0 | 0.2183 | 0.0 | 0.0 | -0.9759 | 0.0 |
| 47.109 | 0.0 | 0.0 | 0.9759 | 0.0 | 0.0 | 0.2183 | 0.0 |
| 75.140 | 0.0404 | 0.0 | 0.0 | 0.0972 | 0.0 | 0.0 | 0.9944 |
| 75.140 | 0.0 | 0.9944 | 0.0 | 0.0 | -0.0972 | 0.0 | 0.0404 |

Last step, let's calculate the neutron spectrum with the CFLevels object:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig, Yb = cef.importCIF('Yb2Ti207.cif')
8
9 ##### print eigenvectors
10
11 Yb.printLaTexEigenvectors()
12
13 ##### plot neutron spectrum
14
15 hw = np.linspace(0,100,200)
16 intens = Yb.normalizedNeutronSpectrum(hw, Temp=20, |
17     ResFunc= lambda x: 4, gamma = 1)
18
```

What is this function?

```
intens = Yb.normalizedNeutronSpectrum(hw, Temp=20, ResFunc= lambda x: 4, gamma = 1)
```

Array of
energy values

Temperature
(in Kelvin)

Gaussian peak width
resolution function,
in meV
(can in general be
energy dependent, in
this case it is not.)

Lorentzian peak width
in meV

What is this function?

```
intens = Yb.normalizedNeutronSpectrum(hw, Temp=20, ResFunc= lambda x: 4, gamma = 1)
```

Array of
energy values

Temperature
(in Kelvin)

Gaussian peak width
resolution function,
in meV
(can in general be
energy dependent, in
this case it is not.)

Lorentzian peak width
in meV

Note: “`normalizedNeutronSpectrum`” should be used when the k_f/k_i factor is not present in the data (typical for time of flight measurements).

If this correction is present, use “`neutronSpectrum`” (must provide the incident energy).

If you're not sure, ask your instrument scientist!

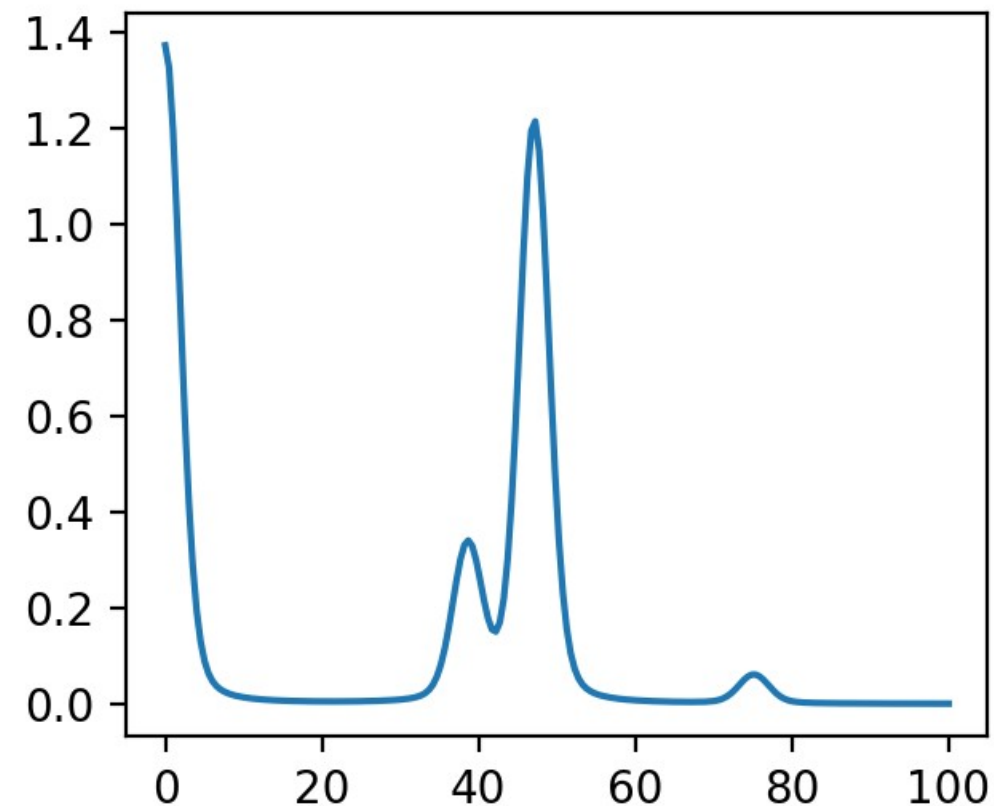
...and plot the calculated data with Matplotlib

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig, Yb = cef.importCIF('Yb2Ti207.cif')
8
9 ##### print eigenvectors
10
11 Yb.printEigenvectors()
12
13 ##### plot neutron spectrum
14
15 hw = np.linspace(0,100,200)
16
17 intens = Yb.normalizedNeutronSpectrum(hw, Temp=20,
18     ResFunc= lambda x: 4, gamma = 1)
19
20 plt.figure()
21 plt.plot(hw, intens)
22 plt.show()
```

...and plot the calculated data with Matplotlib

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3 import PyCrystalField as cef
4
5 ##### Import CIF file
6
7 YTOlig, Yb = cef.importCIF('Yb2Ti207.cif')
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9 ##### print eigenvectors
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11 Yb.printEigenvectors()
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16
17 intens = Yb.normalizedNeutronSpectrum(hw, Temp=20,
18     ResFunc= lambda x: 4, gamma = 1)
19
20 plt.figure()
21 plt.plot(hw, intens)
22 plt.show()
```

Navigation icons: Home, Back, Forward, Zoom In, Zoom Out, Pan, Fit, Save. Status: x=45.8 y=1.350



Final bit: calculate the g-tensor

```
12
13 ##### plot neutron spectrum
14
15 hw = np.linspace(0,100,200)
16
17 intens = Yb.normalizedNeutronSpectrum(hw, Temp=20,
18     ResFunc= lambda x: 4, gamma = 1)
19
20 plt.figure()
21 plt.plot(hw, intens)
22 plt.show()
23
24 ##### print g tensor
25
26
27 g = Yb.gtensor()
28 print('G tensor:\n',g)
```

Output:

```
G tensor:
[[-4.11887922  0.          0.          ]
 [ 0.          -4.11887922  0.          ]
 [ 0.           0.          2.02703635]]
```


Part 2: Fit neutron scattering data

Let's use some legacy data:

PHYSICAL REVIEW B **88**, 104421 (2013)



Crystal-field states of Pr^{3+} in the candidate quantum spin ice $\text{Pr}_2\text{Sn}_2\text{O}_7$

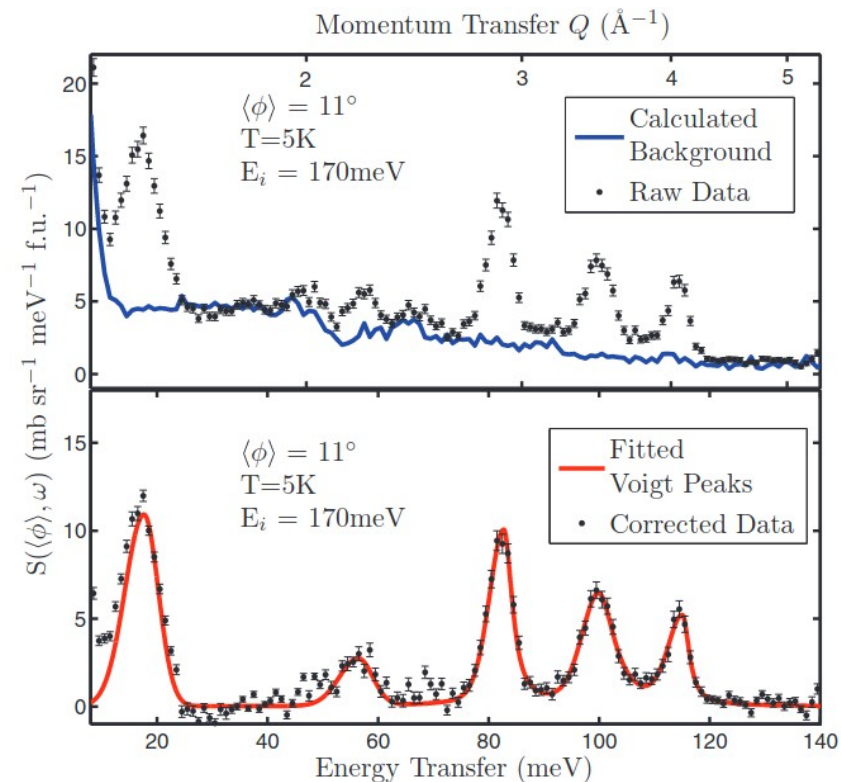
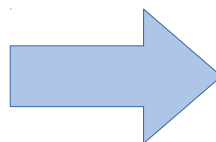
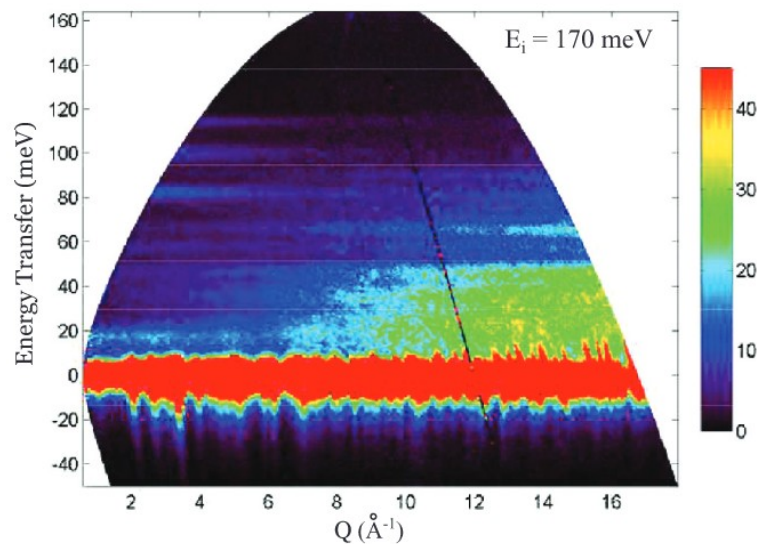
A. J. Princep,^{*} D. Prabhakaran, and A. T. Boothroyd[†]

Department of Physics, University of Oxford, Clarendon Laboratory, Parks Road, Oxford, OX1 3PU, United Kingdom

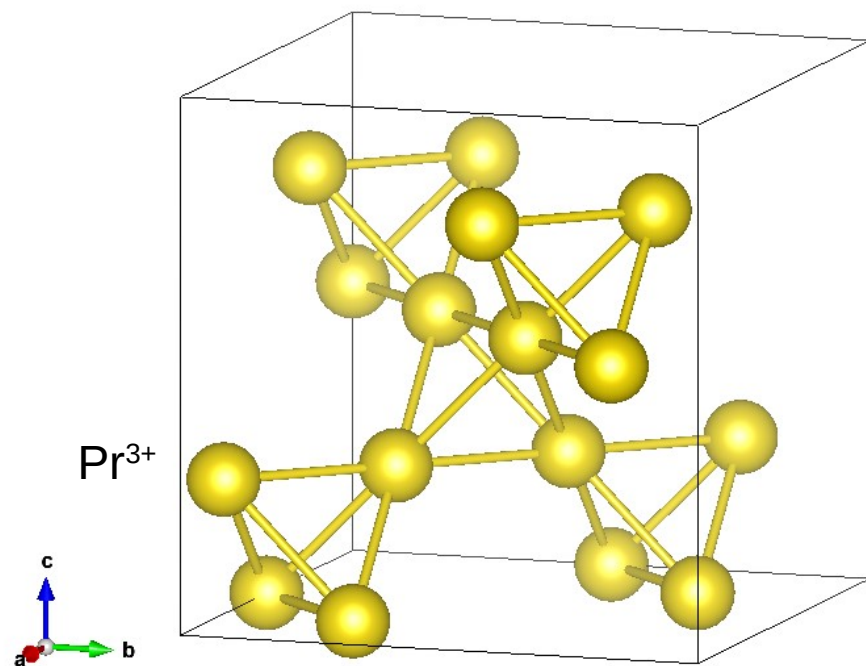
D. T. Adroja

ISIS Facility, Rutherford Appleton Laboratory, STFC, Chilton, Didcot, Oxon, OX11 0QX, United Kingdom

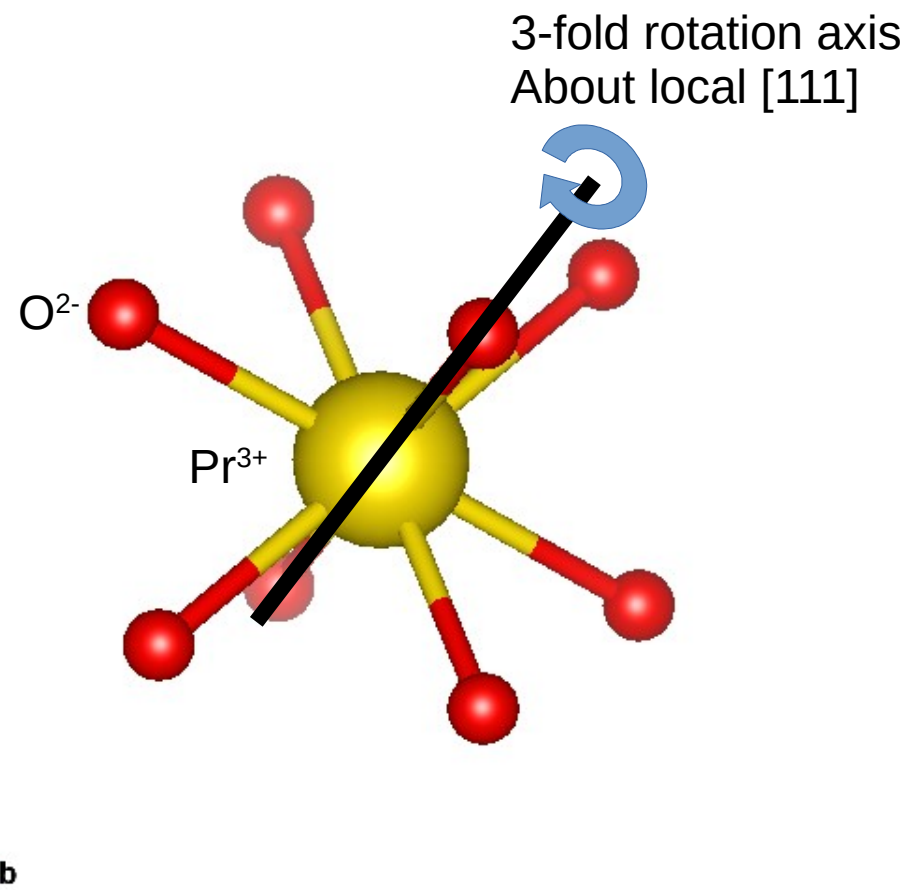
(Received 4 June 2013; revised manuscript received 2 September 2013; published 23 September 2013)



$\text{Pr}_2\text{Sn}_2\text{O}_7$ crystal structure:



Pyrochlore lattice

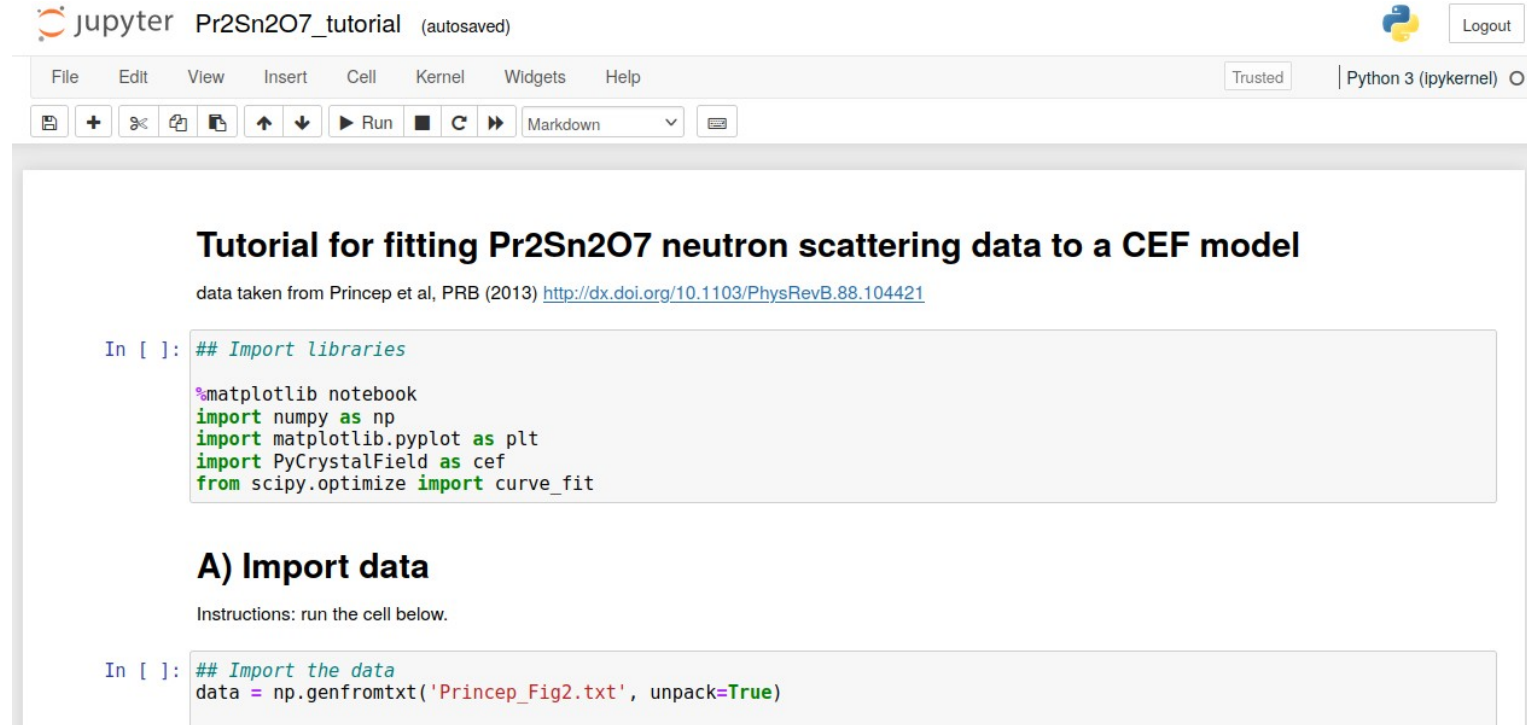


The procedure we'll follow:

1. Get eigenvalues from the data
2. Create a point charge model
3. Fit the effective charges (not necessary here, but sometimes this helps)
4. Fit the nonzero Stevens operators

Get started:

- Start Jupyter notebook
- Open Part2/PrSn2O7_tutorial.ipynb



The screenshot shows a Jupyter Notebook titled "Pr2Sn2O7_tutorial (autosaved)". The interface includes a top menu bar with options like File, Edit, View, Insert, Cell, Kernel, Widgets, and Help. Below the menu is a toolbar with icons for saving, adding cells, and running code. The notebook content starts with a title "Tutorial for fitting Pr2Sn2O7 neutron scattering data to a CEF model" followed by a citation: "data taken from Princep et al, PRB (2013) <http://dx.doi.org/10.1103/PhysRevB.88.104421>". The first code cell, labeled "In []:", contains the following Python code:

```
## Import libraries
%matplotlib notebook
import numpy as np
import matplotlib.pyplot as plt
import PyCrystalField as cef
from scipy.optimize import curve_fit
```

 The second section, titled "A) Import data", includes instructions to "run the cell below." and a second code cell, also labeled "In []:", containing:

```
## Import the data
data = np.genfromtxt('Princep_Fig2.txt', unpack=True)
```

Switch to the Jupyter notebook...

Our result:

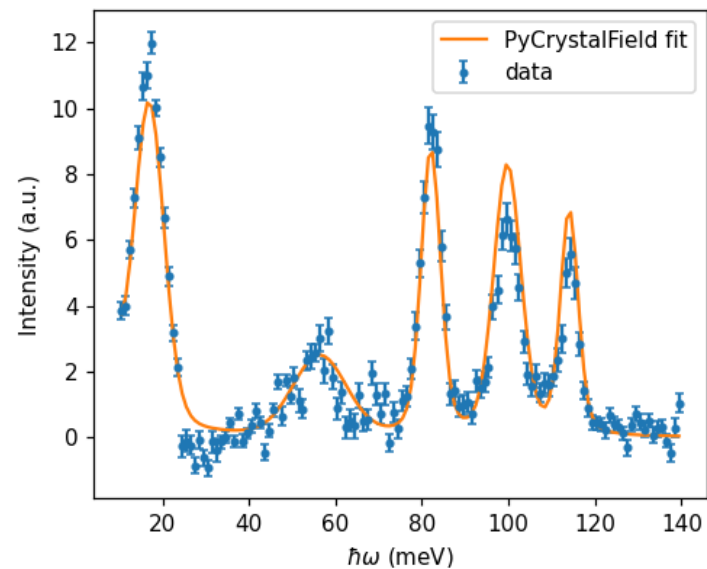
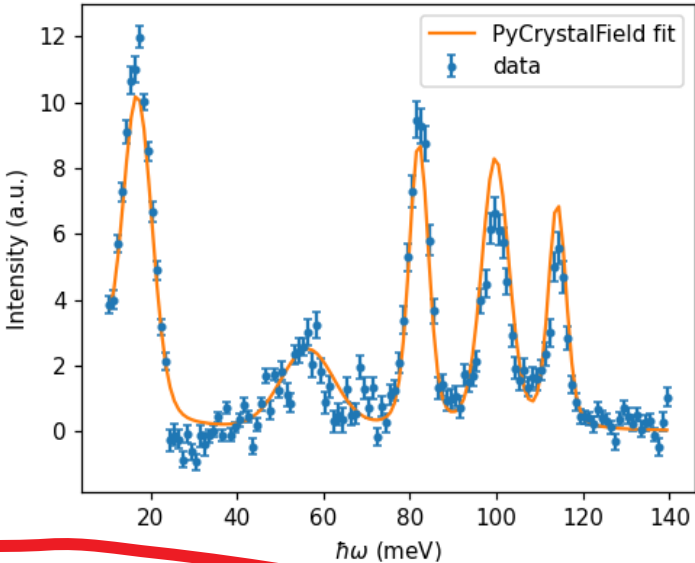


Table I. Eigenvectors and Eigenvalues...

| E (meV) | $ -4\rangle$ | $ -3\rangle$ | $ -2\rangle$ | $ -1\rangle$ | $ 0\rangle$ | $ 1\rangle$ | $ 2\rangle$ | $ 3\rangle$ | $ 4\rangle$ |
|---------|--------------|--------------|--------------|--------------|-------------|-------------|-------------|-------------|-------------|
| 0.000 | -0.944 | 0.0 | 0.0 | -0.2746 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 |
| 0.000 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 | 0.2746 | 0.0 | 0.0 | -0.944 |
| 16.916 | 0.0 | 0.2944 | 0.0 | 0.0 | 0.9092 | 0.0 | 0.0 | -0.2944 | 0.0 |
| 56.315 | -0.2907 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | -0.0675 | 0.0 | 0.0 |
| 56.315 | 0.0 | 0.0 | 0.0675 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | 0.2907 |
| 82.063 | 0.0 | -0.6429 | 0.0 | 0.0 | 0.4163 | 0.0 | 0.0 | 0.6429 | 0.0 |
| 99.752 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 | -0.117 | 0.0 | 0.0 | 0.1561 |
| 99.752 | 0.1561 | 0.0 | 0.0 | 0.117 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 |
| 114.093 | 0.0 | -0.7071 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | -0.7071 | 0.0 |

Our result:

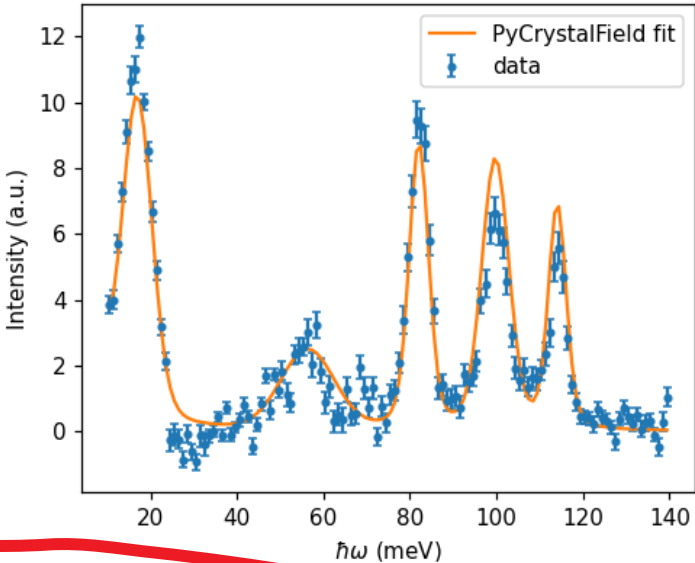


Acts very classically

Table I. Eigenvectors and Eigenvalues...

| E (meV) | $ -4\rangle$ | $ -3\rangle$ | $ -2\rangle$ | $ -1\rangle$ | $ 0\rangle$ | $ 1\rangle$ | $ 2\rangle$ | $ 3\rangle$ | $ 4\rangle$ |
|---------|--------------|--------------|--------------|--------------|-------------|-------------|-------------|-------------|-------------|
| 0.000 | -0.944 | 0.0 | 0.0 | -0.2746 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 |
| 0.000 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 | 0.2746 | 0.0 | 0.0 | -0.944 |
| 16.916 | 0.0 | 0.2944 | 0.0 | 0.0 | 0.9092 | 0.0 | 0.0 | -0.2944 | 0.0 |
| 56.315 | -0.2907 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | -0.0675 | 0.0 | 0.0 |
| 56.315 | 0.0 | 0.0 | 0.0675 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | 0.2907 |
| 82.063 | 0.0 | -0.6429 | 0.0 | 0.0 | 0.4163 | 0.0 | 0.0 | 0.6429 | 0.0 |
| 99.752 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 | -0.117 | 0.0 | 0.0 | 0.1561 |
| 99.752 | 0.1561 | 0.0 | 0.0 | 0.117 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 |
| 114.093 | 0.0 | -0.7071 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | -0.7071 | 0.0 |

Our result:



Agrees with Princep, PRB (2013)

$$\Gamma_3^+(0 \text{ meV}) = 0.88|{}^3H_4, \pm 4\rangle$$

Acts very classically

Table I. Eigenvectors and Eigenvalues...

| E (meV) | $ -4\rangle$ | $ -3\rangle$ | $ -2\rangle$ | $ -1\rangle$ | $ 0\rangle$ | $ 1\rangle$ | $ 2\rangle$ | $ 3\rangle$ | $ 4\rangle$ |
|---------|--------------|--------------|--------------|--------------|-------------|-------------|-------------|-------------|-------------|
| 0.000 | -0.944 | 0.0 | 0.0 | -0.2746 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 |
| 0.000 | 0.0 | 0.0 | 0.183 | 0.0 | 0.0 | 0.2746 | 0.0 | 0.0 | -0.944 |
| 16.916 | 0.0 | 0.2944 | 0.0 | 0.0 | 0.9092 | 0.0 | 0.0 | -0.2944 | 0.0 |
| 56.315 | -0.2907 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | -0.0675 | 0.0 | 0.0 |
| 56.315 | 0.0 | 0.0 | 0.0675 | 0.0 | 0.0 | 0.9544 | 0.0 | 0.0 | 0.2907 |
| 82.063 | 0.0 | -0.6429 | 0.0 | 0.0 | 0.4163 | 0.0 | 0.0 | 0.6429 | 0.0 |
| 99.752 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 | -0.117 | 0.0 | 0.0 | 0.1561 |
| 99.752 | 0.1561 | 0.0 | 0.0 | 0.117 | 0.0 | 0.0 | 0.9808 | 0.0 | 0.0 |
| 114.093 | 0.0 | -0.7071 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | -0.7071 | 0.0 |

A method for defining uncertainty:

SciPost

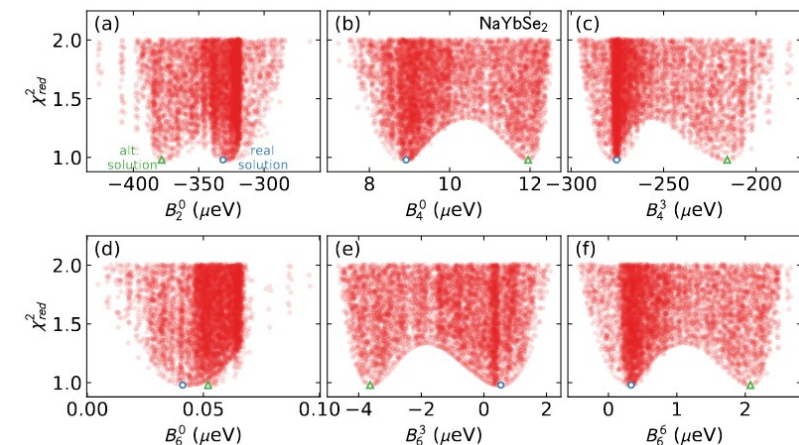
SciPost Phys. Core 5, 018 (2022)

Quantifying uncertainties in crystal electric field Hamiltonian fits to neutron data

Allen Scheie

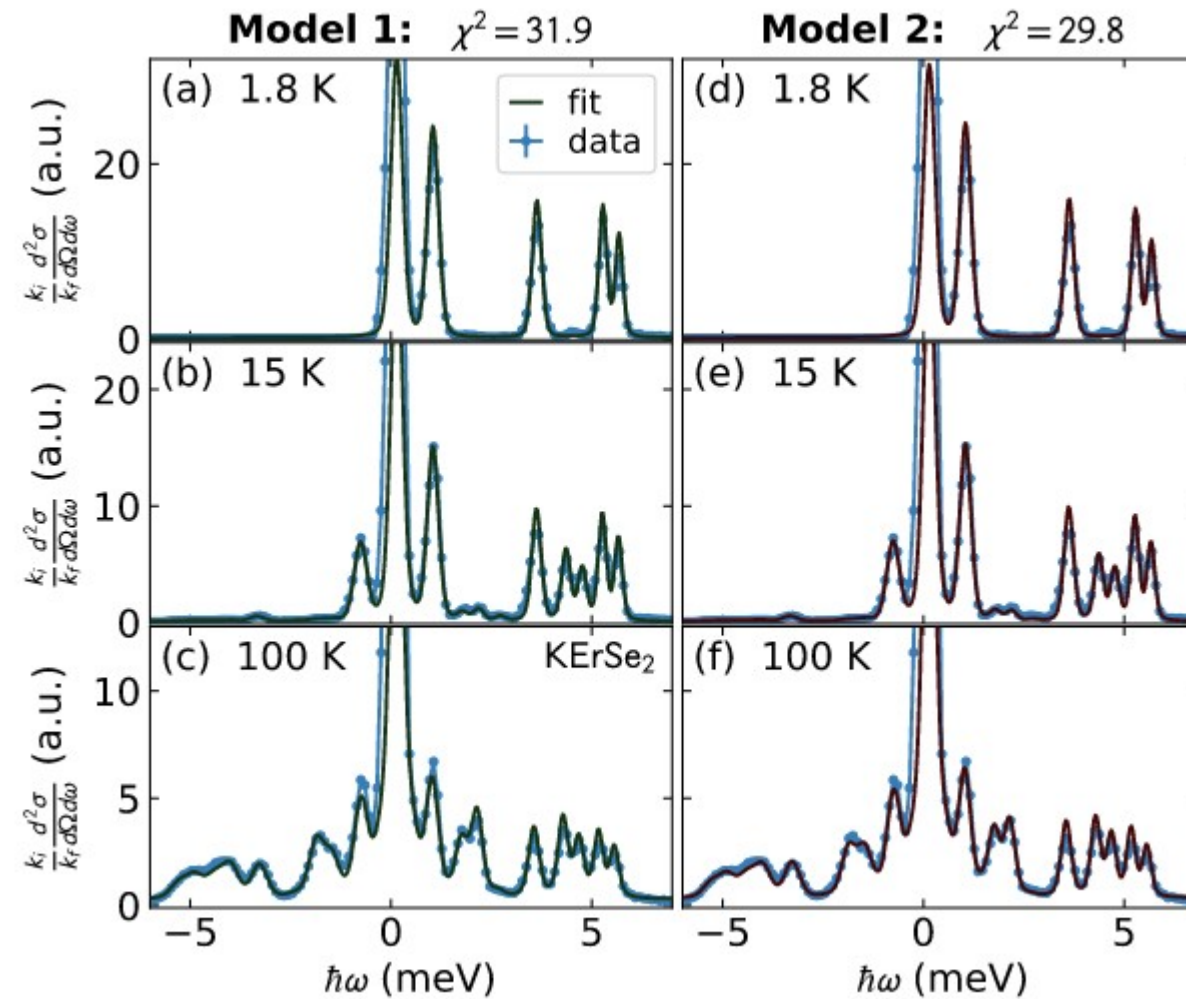
Neutron Scattering Division, Oak Ridge National Laboratory,
Oak Ridge, Tennessee 37831, USA

Key result: a neutron scattering data fit can be badly underdetermined! Explore nearby local minima and compare to bulk data.



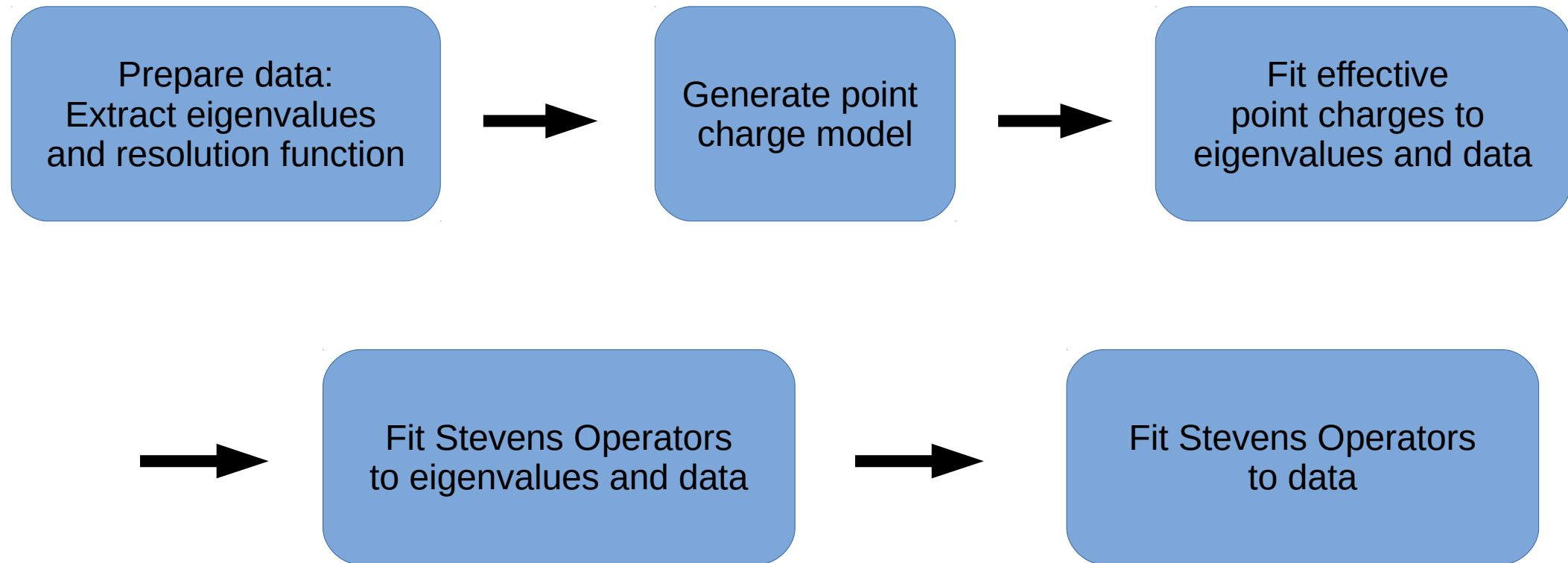
Example of this ambiguity: KErSe₂

Magnetization showed that **Model 1** was correct!



Scheie et al, PRB **101**, 144432 (2020)

Summary of the general workflow:

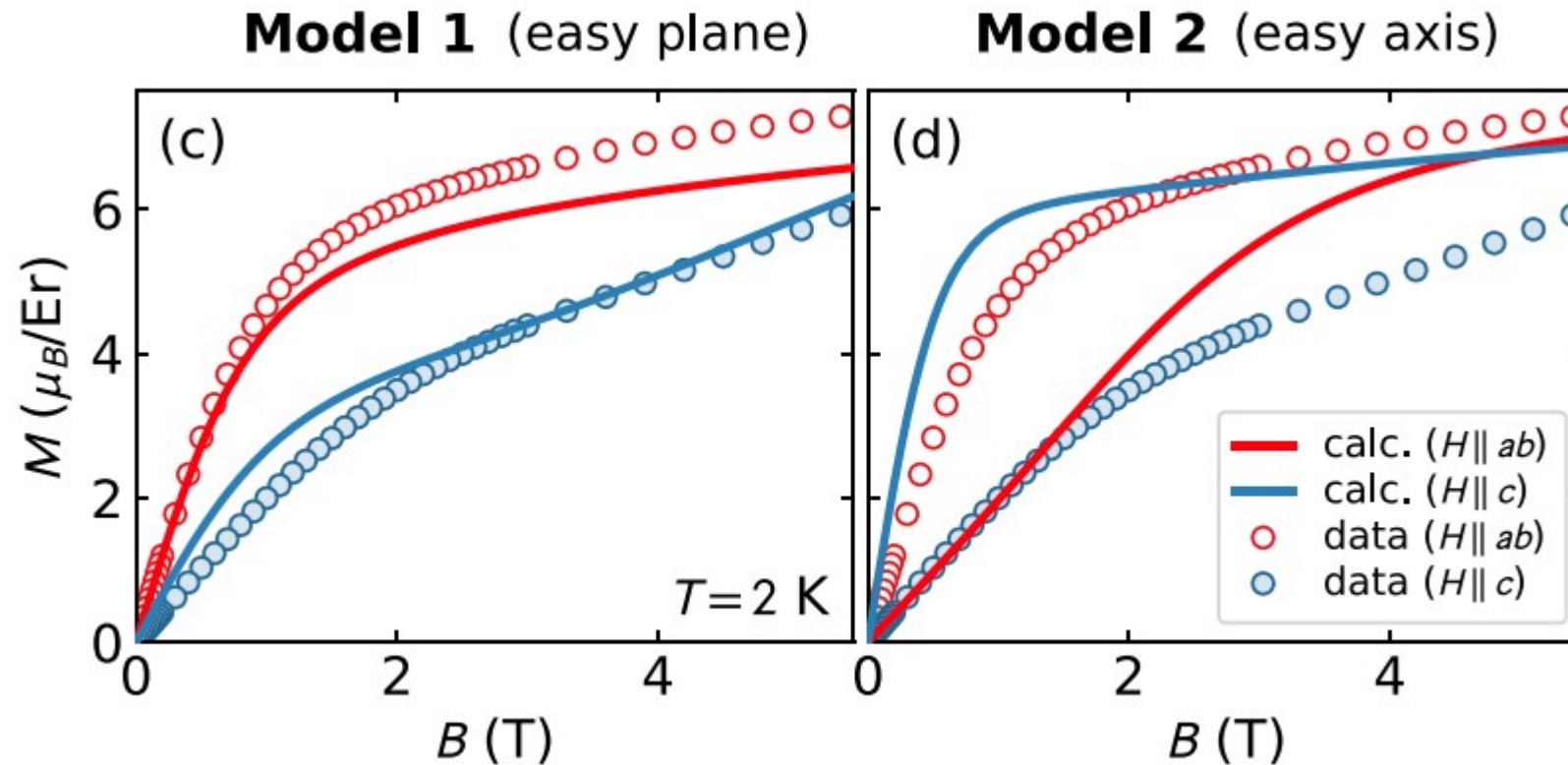


Tips for getting fits to converge:

- Fit iteratively: run a new fit using the starting values from the previous fit, but with a different weight given to the eigenvalue χ^2 .
 - Might need to “kick” it out of a local minimum by changing a parameter or two.
- Define the resolution function carefully so the peak widths match experiment.
- Try different optimization routines (e.g., “Powell” vs. “Nelder-Mead”)

Part 3: calculating magnetization and susceptibility

It is helpful to compare fitted Hamiltonians to bulk heat capacity and magnetization.



An example of how to do this with PyCrystalField: Part3/KES.py

We use a point charge model of delafossite KErSe₂

```
##### Import CIF file  
  
KESLig, Er = cef.importCIF('KErSe2.cif')  
  
##### print eigenvectors  
  
Er.printEigenvectors()
```

An example of how to do this with PyCrystalField: Part3/KES.py

Calculating magnetization:

```
##### calculate magnetization at 2 K

temp = 2 #temperature in K

FieldStrengths = np.linspace(-10,10,101)
magnetization = np.zeros((len(FieldStrengths), 3, 3))
ion='Er3+'
for i, fs in enumerate(FieldStrengths):
    magnetization[i,0] = Er.magnetization(ion, temp, [fs,0,0]) # field along X
    magnetization[i,1] = Er.magnetization(ion, temp, [0,fs,0]) # field along Y
    magnetization[i,2] = Er.magnetization(ion, temp, [0,0,fs]) # field along Z
```

Notes:

- The `Er.magnetization` command returns a three-component vector, in case off-diagonal magnetization response is of interest.
- This is in the local axis frame, NOT the unit cell frame. If you have multiple ions at different angles (like pyrochlores), you need to calculate many magnetization directions and average.

An example of how to do this with PyCrystalField: Part3/KES.py

Calculating susceptibility:

```
##### Calculate temperature dependent susceptibility
### in a 0.5 T field

Temperatures = np.arange(2,300,2)

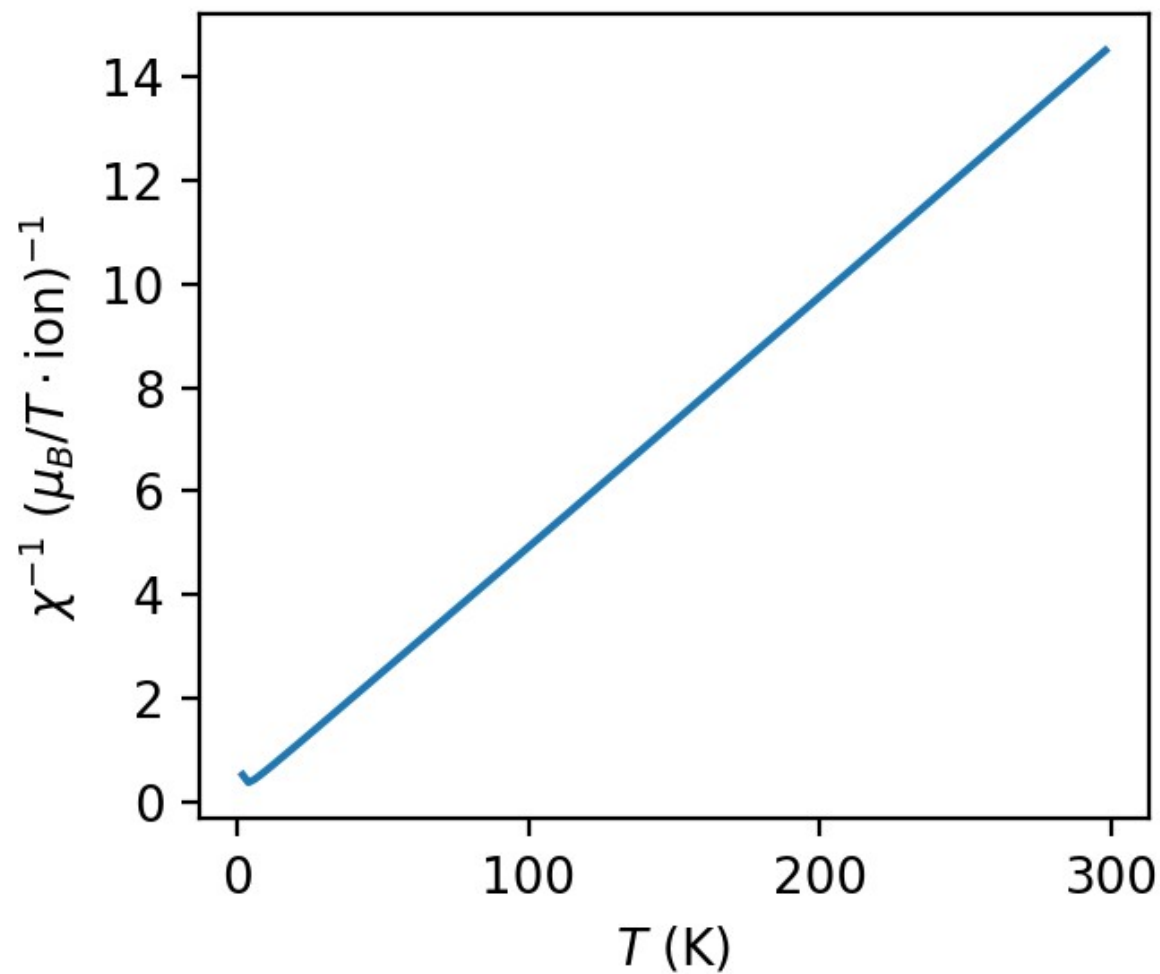
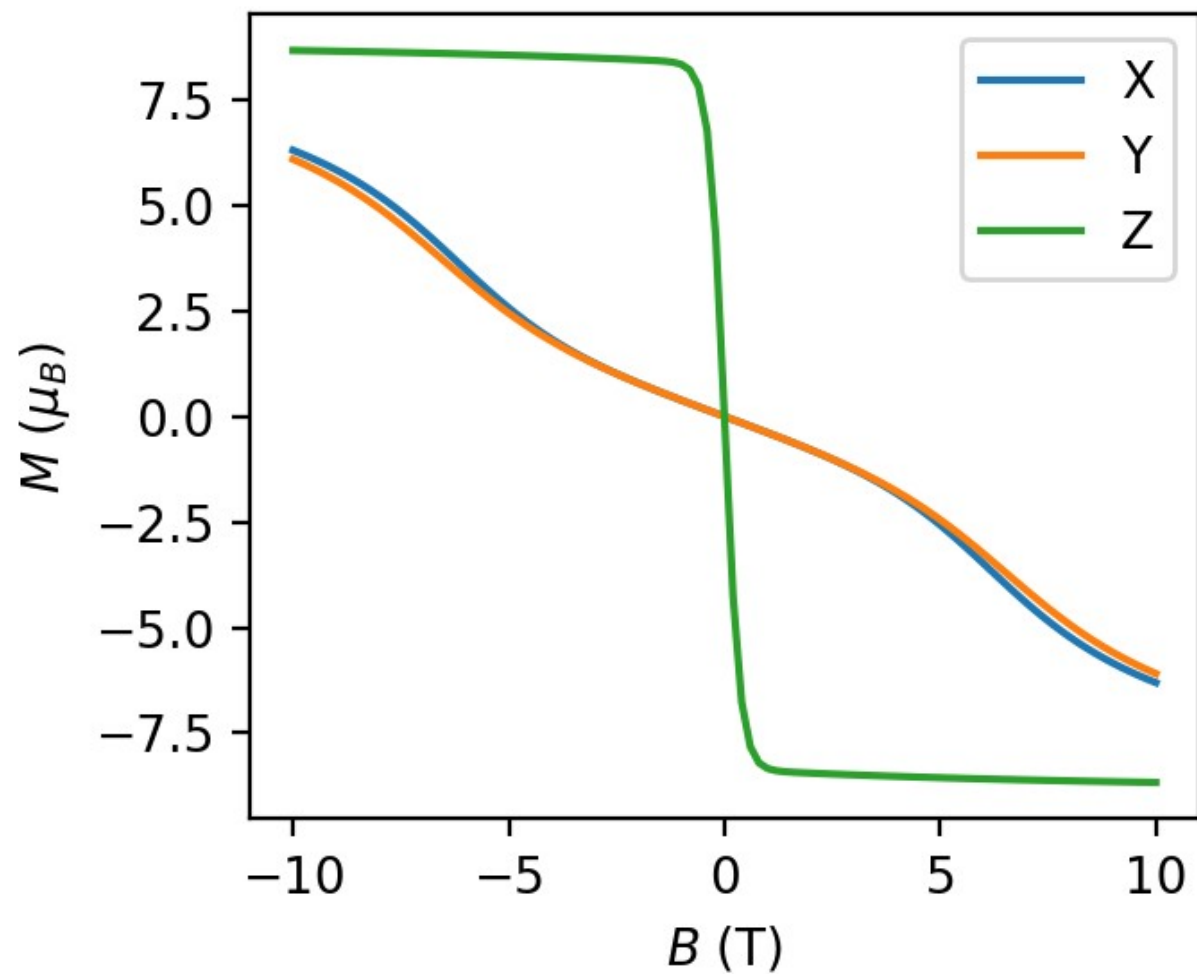
# # For single crystal susceptibility, Field is a vector
# CalcSuscep = Er.susceptibility(ion='Er3+', Temps=Temperatures,
#                               Field=[0.5, 0 ,0], deltaField=0.001)

# For powder average susceptibility, Field is a scalar
CalcSuscep = Er.susceptibility(ion='Er3+', Temps=Temperatures,
                               Field=0.5, deltaField=0.001)
```

Notes:

- `deltaField` is the difference in field used to take a numerical derivative.
- For single crystal susceptibility, the `Field` variable should be a three-component vector.

Output:



Magnetization/susceptibility can be used to check fits.

- Be careful: magnetic exchange will in general affect the magnetization, which can be hard to model.
- Because of this, I have had very limited success fitting a model using magnetization and susceptibility.

