A super-resolution technique to analyze single-crystal inelastic neutron scattering
 measurements using direct-geometry chopper spectrometers<sup>a)</sup>

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8 (Dated: 9 January 2022)

Direct-geometry time-of-flight chopper neutron spectroscopy is instrumental in studying 9 dynamics in liquid, powder, and single crystal systems. We report here that *real*-space 10 techniques in optical imagery can be adapted to obtain *reciprocal*-space super resolution 11 dispersion for phonon or magnetic excitations from single-crystal neutron spectroscopy 12 measurements. The procedure to reconstruct super-resolution energy dispersion of excita-13 tions relies on accurate determination of the momentum and energy-dependent point spread 14 function, and a dispersion correction technique inspired by an image disparity calculation 15 technique commonly used in stereo imaging. Applying these methods to spinwave dis-16 persion data from a virtual neutron experiment demonstrates  $\sim$ 5-fold improvement over 17 nominal energy resolution. 18

<sup>&</sup>lt;sup>a)</sup> This manuscript has been authored by UT-Battelle, LLC, under contract DE-AC05-00OR22725 with the US Department of Energy (DOE). The US government retains and the publisher, by accepting the article for publication, acknowledges that the US government retains a nonexclusive, paid-up, irrevocable, worldwide license to publish or reproduce the published form of this manuscript, or allow others to do so, for US government purposes. DOE will provide public access to these results of federally sponsored research in accordance with the DOE Public Access

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## 19 I. INTRODUCTION

Inelastic neutron scattering (INS) is a powerful probe of fundamental excitations in solids, in-20 cluding those of vibrational or magnetic origins. Neutron scattering from these excitations are 21 characterized by the 4-dimensional (4D) scattering function,  $S(\mathbf{Q}, E)$ , where  $\mathbf{Q}$  is the momentum 22 transfer and E the energy transfer. In recent years the use of highly pixelated detector arrays in 23 conjunction with direct-geometry chopper spectrometer (DGS) instruments<sup>1-7</sup> has allowed for ef-24 ficient measurements of single crystal 4D  $S(\mathbf{Q}, E)$  functions over large ranges of  $\mathbf{Q}$  and E. One 25 single measurement of a single-crystal sample at a DGS instrument captures the sample scattering 26 function  $S(\mathbf{Q}, E)$  on a 3-dimensional (3D) manifold in the 4D  $\mathbf{Q}, E$  space. Typically, a sample is 27 rotated around a single axis, while maintaining a single wavelength (i.e. monochromatic energy) 28 of incident neutrons, to scan the 4D Q, E volume. A series of 3D manifolds measured during 29 the scan are then combined into the volumetric 4D dataset, allowing for extracting 2D slices at 30 high-symmetry **Q** directions by using software packages such as Mantid<sup>8</sup>, Horace<sup>9</sup>, DAVE<sup>10</sup>, 31 Mslice<sup>11</sup>, and Utsusemi<sup>12</sup>. This is done by integrating the measured scattering intensity along 32 two of the four dimensions, yielding a scattering intensity as a function of the remaining two 33 dimensions. Most often this is done to extract dispersion relations of fundamental excitations 34 within crystalline solids by illustrating measured scattering intensity as a function of energy trans-35 fer along the vertical axis and a single direction in wave-vector transfer along the horizontal axis. 36 These extracted dispersion data can be used to directly compare to model calculations of the ma-37 terials dynamics in order to constrain or refine parameters in a model (i.e. the Hamiltonian). For 38 magnetic systems, SpinW<sup>13</sup> is often used to fit spin-wave models to the experimentally obtained 39 dispersion along multiple high-symmetry directions simultaneously. This allows one to obtain ex-40 change parameters or other energy dependent terms in a model Hamiltonian which can represent 41 the spin dynamics of the system. 42

Quantifying a crystalline material's vibrational or magnetic dispersion is key to understanding the system's dynamics. The accuracy of the measured dispersion (and that of the inferred quantities which define the dynamics such as exchange couplings or force constants) obtained from DGS experiments are bound by the instrument resolution. However, a significant number of measurements do not take into account instrumental resolution effects beyond the use of an analytical approximation of a single energy and wave-vector resolution of the instrument. DGS instrument resolution for the  $S(\mathbf{Q}, E)$  scattering function is four-dimensional, and the effects of the resolu-

tion function is compounded by the slope and the curvature of the dispersion surface, making it 50 cumbersome to accurately model. Given a set of instrument and experimental parameters such 51 as chopper settings and the sample shape, the resolution function for DGS neutron scattering in-52 struments still varies at different  $(\mathbf{Q}, E)$  points in the measured dynamical range. This resolution 53 ellipsoid varies considerably across the detector array of the instrument as well as energy transfer. 54 Furthermore, the resolution ellipsoid can have significant tilt that can lead to focusing and defo-55 cusing effects in the measured dispersion depending upon the slope of the dispersion relative to the 56 tilt. This can make it difficult to accurately extract a model based upon the measured dispersions. 57

Recently it was demonstrated<sup>14</sup> that some super-resolution imagery techniques can be adapted 58 to improve energy resolution in a phonon density of states measurement, g(E), based upon neutron 59 scattering techniques. This analysis was performed upon a measurement of the phonon density of 60 states as a function of a single independent variable, energy transfer, which is a routine measure-61 ment for direct geometry chopper spectrometers measuring powder samples. In this work we in-62 troduce a super-resolution technique to improve the ability of extracting dispersion from inelastic 63 neutron scattering measurements of single crystal samples. We use techniques inspired by image 64 correlation methodologies to improve extraction of information from measurements as a function 65 of two independent variables, energy and wave-vector transfer. 66

### 67 II. METHODS

### 68 A. Overview

Dispersion relations are obtained from single crystal measurements at DGS instruments by 69 extracting slices of scattering intensity as a function of energy transfer, E, and wave-vector transfer, 70 **Q**, along high-symmetry directions in reciprocal space. These slices are obtained by integrating a 71 portion of the measured reciprocal space along the two orthogonal reciprocal space directions to 72 the direction of interest in the chosen slice. Constant Q cuts through these 2D slices can then be 73 extracted by integrating a portion of the slices along wave-vector transfer and plotting the resulting 74 scattering intensity as a function of energy transfer. For each constant  $\mathbf{Q}$  cut through a single 2D 75 slice, centers of peaks in the energy spectrum are recorded as the excitation energies for this 76 particular **Q** value. The energy of these peak centers plotted as a function of **Q** are the measured 77 dispersions. An analytic or numerical model of the dispersion can then be directly compared to 78

the experimentally determined dispersion values in order to determine model parameters. This is often done using non-linear curve fitting algorithms. This methodology of extracting dispersion parameters based upon peak location does not account for instrumental energy or wave-vector resolution. Such quantities may shift or skew peak locations and therefore would serve to skew any model parameters determined from comparison of peak positions to model dispersion. The method we present here calculates resolution based corrections to the measured dispersion functions.



FIG. 1. Super-resolution dispersion workflow. An experimental dispersion (open circles in panel B and D) is first obtained from an experimental slice (panel A). This has been routinely done in single crystal DGS data analysis by finding the peak centers,  $E_j$ , of the constant *q*-cuts,  $I(E; q_j)$ , to form the dispersion data points  $\{(q_j, E_j)\}$ . The experimental dispersion is then fit to a dispersion model (an example is shown in panel C) to obtain modelled dispersion (the blue curve in panel D). This preliminary fitting provides a good starting point for the model parameters near the optimal values, and the subsequent steps will make super-resolution corrections. Resolution functions are calculated across the dynamical range of a slice (see panel E). The dispersion model (panel C) with the parameters obtained from fitting done in panel D is convolved with the resolution (panel E) to obtain a modelled slice (panel F). The disparity (panel G) between the modelled slice (F) and the experimental slice (A) is then calculated. Finally, the disparity (G) is used to correct the modelled dispersion (D) and obtain the corrected dispersion (panel H). The units of *q* are reciprocal lattice units (r.l.u.).

Figure 1 shows the steps of this dispersion correction workflow. An experimental slice is first obtained from data reduction (Figure 1A). A dispersion dataset is then obtained directly from the experimental slice,  $E_{\exp;0}(q)$ , following the normal steps outlined earlier. This quantity is shown

as open symbols in Figure 1B. Those excitations are then fit to a dispersion model (in this case the 88 spinwave model generated in SpinW) and relevant parameters (in this case exchange parameters) 89 are obtained (Figure 1A, 1B, 1C, and 1D). The scattering cross section as a function of momentum 90 transfer and energy transfer, including both the dispersion relation and the scattering amplitude, is 91 now determined by the excitation model and relevant parameters. The next step is to obtain the 92 instrument resolution function (Figure 1E). This can be achieved by using analytical calculations 93 (This is often done for triple axis spectrometers<sup>15–18</sup>) or Monte Carlo neutron ray tracing simula-94 tions. More details can be found in section IIB. By convolving the calculated scattering function 95 with the instrument resolution function we can obtain the modelled slice (Figure 1F). Then we 96 can compare the modelled slice and the experimental slice and obtain the energy shifts,  $\Delta E(q)$ 97 (Figure 1G), required to match the modeled slice to the experimental slice. This step is key to 98 the super-resolution dispersion determination, and is further explained in section IIC. The energy 99 shifts obtained can then be applied to the model dispersion curve (from first fit to the experimental 100 data) to obtain corrected dispersion curve (Figure 1H). 101

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$$E_{\text{exp};1}(q) = E_{\text{model};0}(q) + \Delta E(q) \tag{1}$$

The focus of this work is to demonstrate that measured dispersion relations can be corrected taking into account resolution effects, but a natural further step is to fit the dispersion model to the corrected dispersion,  $E_{\exp;1}(q)$ , to obtain the corrected parameters for the Hamiltonian.

#### **B.** Resolution calculation and convolution

The 4D resolution function for a DGS instrument in measurements of single-crystal samples has been modelled analytically<sup>19,20</sup>, using covariance matrix to simplify the treatment. It has also been calculated using Monte Carlo ray-tracing simulations<sup>21–25</sup>, and was sometimes approximated using Gaussian functions when it was used in resolution convolution<sup>26</sup>. However, these corrections are not often taken into account in 4D DGS data analysis due to the complexity of the resolution convolution, and the computing resources required for fitting the dispersion model obtained from a highly pixelated detector array.

<sup>114</sup> Incorporating resolution in the single crystal dispersion fitting workflow is difficult because:

• The resolution is 4D in nature, thus requiring a four-dimensional integration to convolve it with a model  $S(\mathbf{Q}, E)$ . The resolution function varies across the dynamical range, depending on the momentum
 and energy transfer. For example, as the energy transfer increases the energy resolution
 broadening decreases for direct geometry chopper spectrometers

• The resolution ellipsoid can have significant tilt that can lead to focusing and defocusing effects in the measured dispersion depending upon the slope of the dispersion relative to the tilt of the resolution ellipsoid.

123 124 • For some DGS instruments the energy resolution function is asymmetric as a result of the moderation process peculiar to neutron production in spallation neutron sources<sup>27</sup>.

The last point here has very rarely been taken into account previously in single crystal dispersion fitting. Further, to fit the dispersion model incorporating the instrument resolution requires multiple evaluation of the dispersion model with varying parameters, as well as resolution convolution with the model for each set of parameters. The number of iterations depends on the optimization algorithm used and how close the initial guess was to the optimal model parameters. Such an optimization procedure can be demanding in both programming and computing resources.

The super-resolution procedure outlined in this work is agnostic to the technique of resolution calculation and convolution. In this work we have chosen to use a technique based on the Monte Carlo ray tracing simulation to illustrate the super-resolution methodology.

The MCViNE package<sup>22,28</sup> has been used to compute the resolution function for single crystal 134 measurements at DGS instruments<sup>22,24,25</sup>. The procedure is reused here to simulate the resolution 135 function (or point-spread function). The simulation starts with a beam simulation that matches 136 experimental conditions such as incident energy and chopper settings. In order to calculate the 137 energy and wave-vector resolution function with MCViNE, we use a virtual sample that has the 138 same geometric shape and lattice parameters of the real sample to scatter neutrons in the vicinity 139 of a particular set of momentum and energy transfer h, k, l, E. In the simulation we also take 140 advantage of the measured UB matrix to orient the virtual sample just like what has been measured 141 during the experiment. The virtual sample is also rotated around the vertical axis to a particular  $\omega$ 142 angle, similar to what happens in real measurements. The SEQUOIA detector system is simulated 143 according to its specification such as the positions and orientations of all detector packs, the <sup>3</sup>He 144 tube radius, length, and its spacing in the detector pack, the pressure of <sup>3</sup>He gas in the detector 145 tubes, and the detector pixel height. Only events that arrive at the particular detector pixel and 146 time-of-flight bin corresponding to the nominal h, k, l, E are collected. These detector events are 147

then reduced to  $\tilde{h}, \tilde{k}, \tilde{l}$  and  $\tilde{E}$ . Those  $\tilde{h}, \tilde{k}, \tilde{l}, \tilde{E}$  values center around the nominal h, k, l, E, as expected. The differences between those  $\tilde{h}, \tilde{k}, \tilde{l}, \tilde{E}$  from the nominal h, k, l, E are kept in a list of dh, dk, dl, dE. The Monte Carlo ray tracing approach captures details of the 4D resolution function including, for example, the asymmetrical energy dependent line-shape mentioned previously.



FIG. 2. Example resolution functions for the 00L slice at q = L = 1.3, E = 5.0. The 2D resolution function R(q, E) is first simulated by using MCViNE, and then fitted to an analytical function.

To decrease the complexity of the resolution modeling and convolution, we perform them in 152 two dimensions along the two axes of a slice. The details of the convolution will be presented later 153 in this manuscript. We calculate a list of dq from the saved list of dh, dk, dl, where q is along the 154 high-symmetry Q direction of the slice of interest. The dq, dE events are then histogrammed into 155 a profile of the point spread function (PSF) for the 2D slice. This procedure is repeated for the 156 points on a grid on the (q, E) plane. Each PSF at one grid point is fit to a sheared 2D function, 157 with one axis which is "energy-like" and has an asymmetric shape, and another axis which is 158 "momentum-like" and modelled as a gaussian. An example of this parameterization is presented 159

in Figure 2. Then an interpolation of the fitted parameters allows us to calculate the PSF function at any point in the q, E space.

Before convolution, the scattering intensities of the dispersion model are first integrated along the two  $\mathbf{Q}$  directions perpendicular to the q direction for the slice of interest. Then the integrated data is convolved with the 2D resolution function modelled earlier to obtain the convoluted slice. This convolution method is a good approximation of the full 4D convolution, and an example is shown in section III B to demonstrate that.

# 167 C. Correction of dispersions

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The basic idea here is to compare the two slices, namely the experimental slice (Figure 1A) and 168 the resolution-convolved modelled slice (Figure 1F), to find the displacements between the disper-169 sions in the two images which can then be used to correct the model. Finding displacements (or 170 disparity) in two images has been a long-standing challenge in image processing. Stereo imaging 171 techniques that uncover depth information of a scene captured in two images by finding disparity 172 field between the images have been reviewed multiple times during the last few decades  $^{29-31}$ . The 173 techniques in traditional stereo vision find the disparity field d(x, y) that minimizes the difference 174 between the left image (image taken by a camera on the left) and the right image (image taken by 175 a camera on the right) warped by the disparity: 176

arg min<sub>d(x,y)</sub> 
$$\sum_{x,y} |I_l(x, y) - I_r(x, y - d(x, y))|.$$
 (2)

Used in this formula is the sum of the absolute differences, but often the sum of square differ-178 ences, or normalized cross correlation are also used.  $I_l(x, y)$  and  $I_r(x, y)$  are left and right image 179 intensities, and d(x, y) is the displacement along y. Local methods for dense disparity calculation 180 minimize cost functions (Equation 2) for local patches, while global methods<sup>32,33</sup> and semi-global 181 methods<sup>34</sup> take the smoothness of disparity into account by constraining the disparity d(x,y) us-182 ing regularization. Advancements in computing techniques for disparity calculation have been 183 proven useful in many fields of quantitative research, including remote-sensing and geophysics<sup>35</sup>. 184 We aim to reuse the disparity calculation technique to estimate the displacement field between 185 the experimental slice and the resolution-convolved model slice. In this first demonstrative work 186 for application of image disparity calculation in the data analysis of neutron scattering measure-187 ments, we simplify the problem by limiting the slice to only one visible dispersion; therefore, 188

the displacement field can be simplified to be independent of E, and the minimization problem becomes

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$$\arg\min_{\Delta E(q)} \sum_{q,E} |I_{exp}(q,E) - I_{model}(q,E - \Delta E(q))|.$$
(3)

<sup>192</sup> The simplification of limiting the displacement field to be independent of *E* makes this optimiza-<sup>193</sup> tion problem straightforward to program by using a SciPy<sup>36</sup> optimizer, for example.

### 194 III. RESULTS

## **195 A.** The example dataset

In this work we illustrate the super-resolution dispersion technique using a synthetic dataset that 196 resembles a real experimental dataset, for which the full analysis will be reported elsewhere<sup>37</sup>. In 197 the experiment, a Mn<sub>3</sub>Si<sub>2</sub>Te<sub>6</sub> single-crystal sample was measured at the SEQUOIA instrument<sup>3</sup> 198 with incident energy  $E_i = 60$  meV in the high flux mode, and the sample was rotated at least 180 199 degrees about the vertical axis, one degree per step, to cover a large volume in the reciprocal 200 space. Slices along multiple high-symmetry directions show clear dispersions. The dispersions 201 along those high-symmetry directions were obtained by finding centers of peaks in constant q202 cuts. They were fit to a Hamiltonian without on-site anisotropy, but which allows for anisotropic 203 interactions for each of the exchange interactions to account for the spin-orbit coupling<sup>37</sup> 204

$$H = J_1 \sum_{\langle i,j \rangle} [S_i^x S_j^x + S_i^y S_j^y + \Delta_1 S_i^z S_j^z] + J_2 \sum_{\langle i,j \rangle} [S_i^x S_j^x + S_i^y S_j^y + \Delta_2 S_i^z S_j^z] + J_3 \sum_{\langle i,j \rangle} [S_i^x S_j^x + S_i^y S_j^y + \Delta_3 S_i^z S_j^z].$$

$$(4)$$

Here,  $\{J_i\}$  are exchange coefficients as shown in Figure 3 while  $\{\Delta_i\}$  introduce anisotropy.

## 210 B. Synthetic data

First we build a synthetic dataset for which we know the exact model and parameters for the dispersion surface. The synthetic dataset is obtained from a virtual neutron experiment performed by using the MCViNE software. MCViNE contains a scattering kernel that scatters neutrons according to a dispersion surface that a user can define by using arbitrary analytical functions<sup>22,23,28</sup>.



FIG. 3. The magnetic structure of  $Mn_3Si_2Te_6$  and the exchange couplings between magnetic sites. The red and blue arrows follow the easy-plane directions of the spins in the ordered phase. The exchange  $J_1$  is between the second nearest neighbor and shown as blue lines between Mn sites. The exchange  $J_2$  is between the first nearest neighbor and shown as yellow lines within the honeycomb layers of the Mn sites. The exchange  $J_3$  is between the third nearest neighbor, and shown as dashed green lines, which are only drawn for one portion of the lattice for clarity of the figure

Therefore, an analytical dispersion function similar to the dispersion surface of the spinwave model defined by Equation 4 was employed. The spin coupling constants used in the spinwave model in Equation 4 were  $J_1 = 1.663$  meV,  $J_2 = 0.477$  meV,  $J_3 = 0.835$  meV,  $\Delta_1 = 0.390$ ,  $\Delta_2 = -0.554$ ,  $\Delta_3 = -0.431$ . Analytical functions were used to approximate the dispersion and scattering intensity in the vicinity of the (002) wave-vector, and they were parameterized as

$$E(h,k,l) = E_b + E_a \left\{ (1+0.61\sin^2 \pi h)(1+0.61\sin^2 \pi k)(1+\sin^{1.6} \frac{\pi l}{2}) - 1 \right\}$$
(5)

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$$S(h,k,l) = S0 \frac{1}{1 + \left(\frac{h}{\Gamma_h}\right)^2} \frac{1}{1 + \left(\frac{k}{\Gamma_k}\right)^2} \frac{1}{1 + \left(\frac{l-2}{\Gamma_l}\right)^2}$$
(6)

where  $E_a = 11.6$  meV,  $E_b = 9.05$  meV, S0 = 14.8,  $\Gamma_h = \Gamma_l = 0.38$  r.l.u.,  $\Gamma_k = 0.35$  r.l.u.

Then we performed a virtual experiment of a sample with this analytical dispersion function and scattering intensity using MCViNE. The simulation and data reduction consists of the following steps:

• Beam simulation. We can reuse the beam simulation performed earlier for the resolution calculation as it contains all the information regarding the instrument.

• Sample scattering simulation. The sample has the same geometrical shape as the real sample, and with the dispersion defined in Equation 6. Simulations with a series of  $\omega$  rotation

angles are performed, matching the real experiment.

• Detector simulation. The scattered neutrons are intercepted by the virtual SEQUOIA detector system, and the neutron events detected are saved in NeXus files, one for each  $\omega$ angle.

• Reduction. The Mantid software<sup>8</sup> is then used to reduce the NeXus data files in the same way as the real experiment, and corresponding slices are made.



FIG. 4. Dispersion corrections for the virtual experimental data

Once we have the virtual experimental data, we perform the super-resolution workflow outlined 236 in Figure 1 upon it. The results are shown in Figure 4. The corrected dispersion shows clear 237 improvement in agreement with the model dispersion curve, compared to the original dispersion 238 obtained directly from the experimental slice. The root-mean-square(RMS) difference between 239 the experimental dispersion data and the model dispersion data was reduced from 1.59 meV to 240 0.32 meV, showing a nearly 5-fold improvement. It is worth noting that the nominal resolution 241 of the SEQUOIA instrument at  $E_i = 60$  meV for the high-flux mode is  $\sim 2$  meV. The fact that one 242 single iteration of our super-resolution workflow can improve the dispersion data accuracy by 5-243 fold means our method is an efficient way to optimize dispersion model while taking into account 244 the instrument resolution effect. 245



FIG. 5. 00L slices: (a) The 00L slice from the virtual experimental data obtained through the same data reduction procedure as the real experimental data using Mantid. (b) The analytical model using parameters fitted to the dispersion data obtained directly from the virtual experimental data, convolved by instrument resolution using the procedure explained in Section II B. (c) The analytical model using parameters fitted to the corrected dispersion data, convolved by instrument resolution. (d) The residual of subtracting the virtual experimental slice by the original dispersion model convolved with instrument resolution. The root mean square (RMS) of the residual is 10.8. (e) The residual of subtracting the virtual experimental slice by the convolved with instrument resolution. The RMS of the residual is reduced to 6.4.

Another way to check the improvement of the dispersion data is to observe the improvement of the fitting parameters in Equation 6. Table I presented the model parameters for the exact model, the fitted model without resolution correction, and the fitted model with resolution correction. Without the correction, we obtained  $E_a = 12.93$ meV and  $E_b = 9.53$ meV while fitting the dispersion data to Equation 6. Compared to the exact values of  $E_a = 11.6$ meV and  $E_b = 9.05$ meV, the fitted values are off by 1.33meV and 0.48meV, respectively. After correction, the fitting results are

| Model  | $E_a ({\rm meV})$ | $E_b ({\rm meV})$ |
|--|-------------------|-------------------|
| Exact  | 11.6              | 9.05              |
| Without resolution correction: fit to dispersion data di-    | 12.93             | 9.53              |
| rectly obtained from virtual experiment                      |                   |                   |
| With resolution correction: fit to corrected dispersion data | 11.80             | 8.78              |

TABLE I. Dispersion model parameters

 $E_a = 11.80$  and  $E_b = 8.78$ , and the errors are reduced to 0.20meV and 0.27meV.

An intuitive illustration of the improvement of the quality of the dispersion model is also pre-253 sented in Figure 5. Here, Figure 5(a) is the 00L slice obtained from the virtual experiment data. 254 Figure 5(b) is the resolution-convolved slice obtained from the dispersion model fitted to the orig-255 inal dispersion data from the virtual experiment without correction. It is clear that the dispersion 256 is shifted upward in comparison to the virtual experimental data in panel (a). Figure 5(c) is the 257 resolution-convolved slice obtained from the dispersion model fitted to the corrected dispersion 258 data, and this slice agrees much better with the experimental slice in panel (a). This agreement is 259 also a validation of our resolution convolution procedure. The better agreement of the corrected 260 disperion model with the virtual experimental data is also evident in the residual plots shown in 261 panel (d) and (e). 262

### 263 C. Real experimental data

We also applied the super-resolution dispersion workflow on the experimental SEQUOIA 264 dataset described in section III A. In the previous section for the virtual experimental data, we 265 apply the super-resolution procedure to one single slice. In comparison, for the real experimental 266 data, we treat multiple slices along different Q directions. The first step of the workflow remains 267 the same; the dispersion data for each slice is first obtained without considering the resolution 268 effect. Then these dispersion data from multiple slices are fitted to the spin-wave model simulta-269 neously to obtain the original set of the model parameters. The fitted model provides dispersion 270 curves and scattering amplitudes for every slices, and they are convolved with resolution func-271 tions to obtained modelled slices. Each modelled slice is then compared to the corresponding 272 experimental slice to obtain disparity curves, which are used to correct the dispersions. The cor-273



FIG. 6. Dispersion corrections for the real experimental slice along 00L near 002.

rected dispersions of all interested slices are then fit to the spin-wave model simultaneously again,
yielding a new set of model parameters. One example of the dispersion correction is presented in
Figure 6 for the 00L dispersion. Energy corrections in the order of 1meV are found near 002. The
full dispersion correction data are reported elsewhere <sup>37</sup>.

## 278 IV. CONCLUSION

A new technique to obtain super-resolution dispersions along high-symmetry Q directions for 279 single crystal measurements employing direct geometry neutron spectrometers is developed. This 280 is done by computing the disparity curve between the resolution-convolved-model slice and the 281 experimental slice and then applying the disparity to correct the dispersion. Here the resolution-282 convolved slice was obtained by convolving the resolution with the scattering intensity of a dis-283 persion model that was fit to the experimental dispersions obtained without any consideration of 284 instrument resolution. The disparity of the slices was obtained by minimizing the difference be-285 tween the experimental slice and the modelled slice warped by disparity, subjecting to the total 286 variation regularization. The technique clearly shows improvements in the determination of dis-287 persions and it is computationally faster, since classical methods would have required multiple 288 iterations of model evaluation and resolution convolution with many more sets of model parame-289

ters. We show that this method can achieve 5-fold super-resolution w.r.t nominal resolution of the
SEQUOIA<sup>38</sup> instrument. The demonstration is facilitated by a MCViNE-based virtual experiment,
which provides the virtual experimental data and the known target model to check the effectiveness
of the super-resolution technique.

This super-resolution dispersion technique is limited by the signal-to-noise ratio as other imag-294 ing techniques. The 2D resolution convolution method used in this work can be updated to use 295 4D resolution convolution to improve the accuracy and the universality of this approach. More 296 sophisticated disparity computation techniques can be adapted to remove the limit of single dis-297 persion per slice. Finally, many image processing techniques may find various applications in 298 neutron data analysis. Another potential application of the disparity calculation technique is to de-299 tect super-resolution variations in dispersions w.r.t temperature/pressure under which the sample 300 is measured. 301

This work focuses on the correction of the dispersion relation E(q) between the excitation energy *E* and its momentum *q*. It can be envisioned that the super-resolution techniques developed in the previous work for powder DGS data<sup>14</sup> can be extended and combined with techniques developed in this work to reconstruct super-resolution I(q, E) slices, reducing the influence of the instrument broadening, and providing information on the intrinsic line-widths of the excitations,  $\Gamma_E(q)$ .

## 308 ACKNOWLEDGMENTS

The authors thank Hillary Smith, Brent Fultz, Garrett Granroth, and Doug Abernathy for fruit-309 ful discussions. This work was partially supported by the Department of Energy, Laboratory Di-310 rected Research and Development SEED funding, under contract DE-AC05-00OR22725. Work 311 at Spallation Neutron Source at Oak Ridge National Laboratory (ORNL) was supported by the 312 Scientific User Facilities Division, Office of Basic Energy Sciences, US Department of Energy 313 (DOE). This research also used resources of the Spallation Neutron Source Second Target Station 314 Project at ORNL. ORNL is managed by UT-Battelle LLC for DOE's Office of Science, the single 315 largest supporter of basic research in the physical sciences in the United States. 316

## 317 DATA AVAILABILITY

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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