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3759 words

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**Raman Match: Application for Automated Identification of Minerals from**

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**Raman Spectroscopy Data**

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Berrada, Meryem<sup>1\*</sup>, McFall, Alan<sup>1</sup>, and Chen, Bin<sup>1</sup>

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<sup>1</sup>Hawai'i Institute of Geophysics and Planetology, University of Hawaii at Manoa.

8

2500 Campus Rd, Honolulu, HI 96822

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\*Corresponding author

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11

**Abstract**

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Raman spectroscopy is a rapid, nondestructive analysis technique that is used in various

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scientific disciplines, including chemistry, materials science, and biology. The analysis

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of Raman spectra and the identification of specific substances in unknown samples can

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be complex and time-consuming tasks due to the large database of Raman spectra. The

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*Raman Match* application was developed to simplify and automate the sample

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identification process through a search and match method. The application integrates

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the well-established RRUFF Raman database with the Python programming language

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and provides a user-friendly graphical interface to load Raman spectra, identify and fit

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peaks, match peaks to the reference libraries, visualize the results, and generate

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publication-ready figures. The application offers a swift and automated method for

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mineral identification using Raman spectroscopy in both laboratory and field settings,

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as well as during planetary exploration missions to extraterrestrial environments with

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constraints on time and resources.

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26 **Keywords:** matching algorithm, peak identification, spectrum analysis, mineralogy,

27 Raman database, python

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## 29 **Introduction**

30 Raman spectroscopy, discovered experimentally by C. V. Raman in 1928  
31 (Raman & Krishnan, 1928), is a powerful vibrational spectroscopy technique for  
32 mineralogical analysis commonly used in terrestrial laboratories. Vibrational  
33 spectroscopies, Raman and infrared, have the ability of positively identifying a  
34 chemical. In Earth and planetary science, Raman spectroscopy serves as an invaluable  
35 nondestructive tool for characterizing the chemical and mineralogical composition of  
36 planetary bodies remotely and for studying phase transitions in controlled laboratory  
37 environments (Angel et al., 2012; Beyssac, 2020; Caracas et al., 2023; Chou & Wang,  
38 2017; Goncharov, 2012; Jehlička & Culka, 2022; Klein et al., 2004; Marshall et al.,  
39 2010; Mattioda et al., 2023; Qi et al., 2023; Sharma et al., 2003; Tu & Chang, 2012;  
40 Yamamoto & Hagiwara, 2022). This analytical tool is also widely used in other fields  
41 such as oncology and chemistry. (Das & Agrawal, 2011; Fenn et al., 2011; Jermyn et  
42 al., 2016; Shvalya et al., 2020). Raman spectroscopy yields insights into the chemical  
43 composition, crystal structure, and molecular vibrations of minerals, allowing for the  
44 detection and monitoring of phase transitions by analyzing shifts or alterations in  
45 Raman peaks (Caracas et al., 2023; Goncharov, 2012).

46 Raman spectroscopy entails the examination of vibrational and rotational modes  
47 of molecules present in a specimen. When photons interact with a molecule, two distinct  
48 scattering processes occur: Rayleigh scattering, which preserves the initial photon

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49 characteristics, and Raman scattering, causing changes in photon properties due to  
50 altered energy levels (Cialla-May et al., 2019). These energy shifts are reflected as  
51 alterations in wavelength ( $\lambda$ ), inversely related to energy, and are typically represented  
52 as wavenumber ( $\sigma = 1/\lambda$ ) in Raman spectra. This visualization facilitates an  
53 understanding of the relationship between energy and wavelength, driven by Planck's  
54 constant and the speed of light. By measuring  $\Delta\sigma$ , Raman spectrometers reveal the  
55 wavelength of inelastically scattered photons, unraveling vibrational modes, chemical  
56 composition, and crystal structures within the sample (Pelletier, 2003). The vibrational  
57 modes of a molecule depend on the molecular structure, masses of atoms involved in  
58 the vibration, and the chemical bonds between various atoms (Ferraro et al., 2003). This  
59 results in a unique spectrum for each chemical, which can distinguish polymorphs of  
60 isochemical materials. Raman analysis has several advantages over passive  
61 spectroscopy, most notable being the sharpness of the spectral features. This allows the  
62 precise detection of specific species, especially in the presence of mineral mixtures.  
63 The Raman spectra of samples contain a wealth of molecular fingerprint information  
64 that can be used to identify inorganic and organic chemicals, biomarkers, biominerals,  
65 hydrous and anhydrous minerals, and new chemical phases based on the vibrational  
66 frequencies, relative intensities, and number of Raman lines in the spectra (Degen &  
67 Newman, 1993; Durben et al., 1991; Kawamoto et al., 2004; Wang et al., 1995). It can  
68 also be used to characterize polymorphs of minerals and organics (Gauldie et al., 1997;  
69 Girlando et al., 2016; Marckmann & Whalley, 2004).

70       Effective preparation of samples is an essential aspect of Raman spectroscopy  
71 measurements, and considerations must be made regarding the nature and physical state  
72 of the sample. Solid samples may require grinding to obtain representative portions,

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73 while geological or mineralogical specimens might require thin sections or polished  
74 surfaces. Liquids can be directly analyzed, but container material selection is essential  
75 to prevent interference. The handling of gaseous samples can be complex, often  
76 requiring specialized cells. To mitigate the fluorescence that can obscure Raman  
77 signals, careful attention must be paid, although reducing laser power and employing  
78 suitable filters usually help to resolve this problem (Wei et al., 2015). Additionally, it  
79 is worth noting that a time-gated system can be used to further address fluorescence-  
80 related issues and enhance the quality of Raman spectroscopy data. Time-gating allows  
81 for the selective detection of Raman signals at specific time intervals, effectively  
82 separating them from background fluorescence, and thus improving the accuracy and  
83 reliability of the measurements. This approach demonstrated its value in samples  
84 susceptible to in fluorescence, making it a potent method in Raman spectroscopy (Misra  
85 et al., 2005).

86         Within a Raman spectrum, peaks correspond to specific vibrational modes of  
87 molecules, with their characteristics extending beyond the molecular vibrational modes.  
88 The features of the peaks, including the full-width at half-maximum (FWHM), conveys  
89 valuable information (Conner et al., 2023; Hong et al., 2022; Obraztsova et al., 1998;  
90 Schiferl et al., 1997). A narrow FWHM indicates a well-defined and distinct peak,  
91 implying a relatively pure molecular vibration unaffected by external factors.  
92 Conversely, a broad FWHM suggests influences from multiple factors, such as  
93 molecular interactions, impurities, or variations in molecular environments. The  
94 vibrational modes present in Raman spectra reflect not only the molecular vibrations  
95 within the mineral or material but also the broader structural components and  
96 arrangements inherent to the crystal lattice. Minerals possess complex and unique

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97 crystalline structures composed of atoms or ions arranged in specific patterns and  
98 orientations. These crystallographic arrangements lead to characteristic lattice  
99 dynamics, influencing the propagation of vibrations throughout the mineral. As  
100 vibrations travel through the crystal lattice, they interact with the structural components,  
101 lattice defects, and boundaries, inducing distinct spectral features. The interplay among  
102 these factors dictates the observed peaks in Raman spectra. For instance, variations in  
103 lattice parameters, crystal symmetry, or the presence of defects within the mineral can  
104 result in shifts, splitting, or broadening of Raman peaks, providing valuable insights  
105 into the structural integrity and properties of the mineral.

106 Analyzing peak properties employing various models (e.g., Gaussian,  
107 Lorentzian, Voigt, Pseudo-Voigt) and accounting for baseline correction aids in  
108 comparing spectra with reference Raman spectra (Ciris, 2023; Ida et al., 2000;  
109 Sparavigna, 2023; Young & Wiles, 1982). In essence, the Gaussian distribution (**Eq.**  
110 **1**), often referred to as the bell curve, takes parameters such as amplitude ( $A$ ), mean ( $\mu$ ),  
111 and standard deviation ( $\sigma$ ) to represent data that follows a normal distribution. The  
112 Gaussian function is widely employed because of its bell-shaped curve, which  
113 resembles many natural distributions. It is particularly useful for modeling symmetric  
114 peaks and is computationally efficient. Gaussian functions help to describe peaks  
115 characterized by Gaussian broadening, representing well-defined and symmetrical  
116 peaks.

$$f(x)_{Gaussian} = A \cdot e^{-\frac{(x-\mu)^2}{2\sigma^2}} \quad (1)$$

117 The Lorentzian distribution (**Eq. 2**), also known as the Cauchy distribution, is  
118 characterized by its sharp peak and long tails. Relevant parameters include amplitude,  
119 mean, and gamma ( $\gamma$ ), which controls the width and shape of the distribution.

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120 Lorentzian functions are employed to describing peaks with tails that extend further  
121 from the central peak, making them suitable for modeling asymmetric peaks and  
122 handling broader line shapes. These functions are beneficial for capturing spectral lines  
123 affected by Lorentzian broadening, prevalent in various spectroscopic techniques.

$$f(x)_{Lorentzian} = \frac{A \cdot \gamma^2}{(x - \mu)^2 + \gamma^2} \quad (2)$$

124 The Voigt function (**Eq. 3**) combines the characteristics of both Gaussian and  
125 Lorentzian distributions. It is often used to fit complex spectral data especially in  
126 spectroscopy, and considers the amplitude, mean, standard deviation, and gamma via  
127 the Faddeeva function  $wofz(z)$ , where  $z$  is  $\frac{x - \mu + i\gamma}{\sigma\sqrt{2}}$ . Voigt functions are particularly  
128 useful in scenarios where a peak exhibits a combination of both broadening types.

$$f(x)_{Voigt} = Re \left[ \frac{A \cdot wofz(z)}{\sigma\sqrt{2\pi}} \right] \quad (3)$$

129 Finally, the Pseudo-Voigt function (**Eq. 4**) is a mixture model that blends both Gaussian  
130 and Lorentzian profiles, where the fraction parameter ( $\eta$ ) determines the contribution  
131 of each model.

$$f(x)_{Pseudo-Voigt} = \eta \cdot f(x)_{Lorentzian} + (1 - \eta) \cdot f(x)_{Gaussian} \quad (4)$$

132 A fraction of 0 corresponds to a pure Gaussian, while a fraction of 1 corresponds to a  
133 pure Lorentzian. The weighted combination allows for flexibility in adjusting the shape  
134 of the fitted peak, providing a more adaptable model for a broad range of line shapes  
135 encountered in experimental data. It offers a good approximation to complex spectral  
136 lines and is widely used for peak fitting due to its flexibility and ability to describe a  
137 variety of peak shapes.

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138 The baseline correction in the peak fitting process follows the Asymmetrically  
139 Reweighted Penalized Least Squares (arPLS), see the Python function `arpls(y)` in **Eq.5**  
140 (Baek et al., 2015).

$$\text{arPLS}(y) = \underset{z}{\operatorname{argmin}} \{ \|W \cdot (y - z)\|_2^2 + \lambda \|D \cdot z\|_2^2 \} \quad (5)$$

141 where  $W$  is a diagonal matrix with elements  $w$ , representing the weight of each data  
142 point signal in  $y$ .  $D$  is a finite difference matrix that approximates the second derivative,  
143 and  $\lambda$  is a tuning parameter. The algorithm iteratively updates the weights  $w$  using a  
144 sigmoidal weighting scheme until convergence, where `argminz` denotes the argument  
145 that minimizes the expression. The sigmoidal weighting scheme is defined as  $w_i =$   
146  $\frac{1}{1 + \exp\left(2 \cdot \frac{d_i - (2s - m)}{s}\right)}$ , for each data point  $i$ , using the standard deviation ( $s$ ), the negative  
147 residuals ( $d$ ), and their mean ( $m$ ). This weighting scheme assigns smaller weights to  
148 data points with larger negative residuals, effectively downweighting outliers. The  
149 output of the arPLS function is  $z$ , representing the baseline correction signal. The  
150 method takes three parameters as input: `lam`, `ratio`, and `itermax`. The first parameter  
151 controls the regularization strength. It is a hyperparameter that balances the smoothness  
152 of the baseline estimate. The second parameter determines the convergence criterion.  
153 If the change in the weighting factor between iterations is below this ratio, the algorithm  
154 stops. The third parameter specifies the maximum number of iterations. The user may  
155 modify the default parameters of the background subtract, or baseline correction, along  
156 with the default parameters for the peak fitting models.

157 Reference Raman spectra are consolidated within the well-established  
158 RRUFF™ Project database (Lafuente et al., 2015), encompassing high-quality spectral  
159 data from well-characterized minerals. These serve as standards for mineralogists,

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160 geoscientists, and gemologists, facilitating mineral identification on Earth and aiding  
161 planetary exploration efforts. However, interpreting Raman spectra and extracting  
162 meaningful information can be challenging due to the complexity of the data and the  
163 various databases available. In addition, visualization tools available in the literature  
164 are typically limited to the associated spectrometers. For example, Horiba LabSpec is  
165 a widely used Raman analysis software that accompanies Horiba Raman spectrometers  
166 (HORIBA Scientific, n.d.). It offers comprehensive tools for data acquisition,  
167 processing, and visualization, although there is no matching process available.  
168 Similarly, Thermo Fisher Scientific Raman spectrometers are accompanied by the  
169 OMNIC software (Thermo Fisher Scientific Raman, n.d.). The software provides  
170 various features for spectral data processing, including spectral subtraction, spectral  
171 search from a limited database, and quantitative analysis. Another common software is  
172 OPUS, used with Bruker Raman spectrometers (Bruker, n.d.). Similar to the previously  
173 mentioned software, users can apply different data treatments, such as a baseline  
174 correction, and perform spectral fitting. Other software such as WiRE, Renishaw's  
175 Raman spectroscopy software, enables data acquisition, processing, and analysis  
176 (Renishaw, n.d.). It includes features such as baseline correction, peak identification,  
177 and chemometric analysis. Finally, the software called CrystalSleuth leverages the  
178 extensive RRUFF database to provide a list of potential mineral matches based on the  
179 full Raman spectrum analysis of a sample. The software displays the top three matches,  
180 ranking them according to their percentage match with the sample spectrum, thereby  
181 offering a comparative view of the closest mineralogical matches. This method  
182 primarily focuses on the overall spectral pattern, considering the collective features of  
183 the spectrum for comparison and match ranking. To our knowledge, only the Renishaw



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184 Empty Modelling tools and CrystalSleuth (Laetsch & Downs, 2006) integrate the  
185 RRUFF database, while the other software programs have unique sample mapping  
186 capabilities. To address the challenges in analysis and to account for home-built Raman  
187 spectroscopy systems which do not work well with commercial software programs, the  
188 *Raman Match* application developed in this study provides a comprehensive set of tools  
189 which include baseline correction, peak fitting, and peak matching for Raman  
190 spectroscopy analysis, along with automated mineral identification capability from  
191 Raman data. The *Raman Match* application adopts a distinct approach from previous  
192 software tools by examining individual peaks within the Raman spectrum. This is  
193 beneficial for samples with complex compositions or composite minerals. It can be used  
194 to identify potential matches by analyzing individual peaks and synthesize the results  
195 to determine the top three most probable mineral matches. This approach improves the  
196 ability to discern and identify a wider range of mineral compositions from a given  
197 spectrum, offering a more nuanced analysis, especially for samples with mixed  
198 mineralogical content. *Raman Match* represents a departure from traditional  
199 methodologies used in mineral identification via Raman spectroscopy, which heavily  
200 rely on manual and time-consuming literature reviews of expected minerals.

201

## 202 **Method and Approach**

203 *Raman Match* is a Python-based application which transforms complex  
204 spectroscopic data into actionable insights. Users are provided with instructions in the  
205 Instruction tab, tools to manually identify the experimental data in the “Manual” tab,  
206 and tools to automatically match with reference Raman spectra in the “Auto” tab. The  
207 application enables users to identify substances, understand molecular structures, and

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208 make informed decisions based on their research findings. The architecture of the  
209 application is summarized in the Supplementary Materials. *Raman Match* is designed  
210 with a user-friendly graphical interface to facilitate easy data analysis. It is built on the  
211 foundation of several key components including user-friendly graphical interface,  
212 customization options, data import and export, data processing and analysis tools,  
213 automation, compatibility, documentation and support, version control and updates,  
214 collaboration and sharing, and speed, which work harmoniously to provide users with  
215 a seamless experience. Users can load Raman spectroscopy data files (i.e., .txt or .csv  
216 files), typically containing information about the intensity of Raman scattering at  
217 various wavelengths. Once the data file is loaded, the application employs various  
218 mathematical and analytical techniques to process it. For example, it can identify the  
219 peaks in the data using an intensity threshold value and the standard deviation on peak  
220 positions. In the Manual tab (see **Figure 1**), users may use any of the fitting models and  
221 corresponding parameters to analyze the peaks identified, after accounting for the  
222 baseline correction if necessary. The best peak fitting parameters, along with the  
223 FWHM method results, are dynamically added to the table in the Manual tab. The user  
224 may save the results with the “Save Table” button. One of the primary functions of the  
225 application is to match the obtained peaks with known molecular signatures stored in a  
226 Structured Query Language (SQL) for Light database. This database, based on the  
227 RRUFF project database, acts as a vast library of known molecular signatures, enabling  
228 the application to make rapid and accurate identifications. In the “Manual” tab, the user  
229 may select files from the database via the search bar to be displayed in the bottom figure  
230 for reference. In the Auto tab (see **Figure 2**), the application looks for similarities  
231 between individual peak positions in the experimental data and the RRUFF database.

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232 The user may guide the accuracy of the matching process by specifying keywords (e.g.,  
233 Si, O, Quartz) to look for or to avoid in the database. Following **Eq.6**, the matching  
234 algorithm loops through the entries of the database looking for elements to “Look for”  
235 or “Avoid” according to the user entries. The first condition of the loop identifies the  
236 minerals for which there is a match with the peak position. The second condition  
237 verifies if the identified mineral remains an option after keeping any of the elements to  
238 look for but removing all those to avoid.

*For any peak in data:*

$$\begin{aligned} \text{condition}_1: & \begin{cases} \text{True} & \text{if } \text{peak}_{data} = \text{peak}_{\text{mineral in database}} \\ \text{False} & \text{if } \text{peak}_{data} \neq \text{peak}_{\text{mineral in database}} \end{cases} \\ \text{condition}_2: & \begin{cases} \text{True} & \text{if } \text{wanted} \setminus \text{avoid} \neq \emptyset \\ \text{False} & \text{if } \text{wanted} \setminus \text{avoid} = \emptyset \end{cases} \\ \text{mineral count} = & \begin{cases} \text{total} + 1 & \text{if } \text{condition}_1 \wedge \text{condition}_2 \\ \text{total} & \text{otherwise} \end{cases} \end{aligned} \quad (6)$$

239 The insights derived from the data analysis are presented in a clear and visual manner:  
240 The bottom figure in the “Auto” tab displays the top three files with the highest  
241 matching score across the complete experimental data, while the right figure displays  
242 the top three files with the highest matching score at each identified peak. This  
243 interactivity empowers users to tailor the analysis to their specific needs (i.e., via the  
244 peak identification threshold, standard deviation, peaks to be removed, and elements to  
245 look for or avoid). The application allows users to save and manage their analysis  
246 results, ensuring that valuable findings are not lost.

247

## 248 **Results and Discussion**

249 Ensuring the reliability and accuracy of the automated mineral identification  
250 process of the application is essential for producing credible and reproducible research

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251 results. *Raman Match* employs several quality control measures to validate and enhance  
252 its performance. One of the key quality control aspects is the accurate identification of  
253 Raman peaks in the experimental data. The software uses peak-finding algorithms to  
254 locate spectral features. Users may modify the peak identification intensity threshold to  
255 ensure that the algorithms reliably detect peaks corresponding to mineral vibrations,  
256 rather than noise in the experimental data. Unknown peaks may also be ignored by  
257 interacting with the peak removal feature in both the Manual and Auto tabs. To account  
258 for variations in data acquisition, the software incorporates spectrum normalization and  
259 baseline subtraction techniques. These techniques ensure that the identified peaks are  
260 not influenced by variations in signal intensity, laser power, or other experimental  
261 factors.

262       Quality control involves testing the software with a diverse set of Raman spectra  
263 from known mineral samples. A known mineral sample, unoriented forsterite crystal,  
264 is included in the package of the software. The experimental data for this crystal is  
265 automatically matched correctly to forsterite files from the RRUFF database in a few  
266 seconds, without the guidance from the user. The validation process confirms the  
267 software's ability to correctly identify minerals. The software is also tested on a sample  
268 of Hawaiian vesicular basalt collected on the island of Oahu (**Figure 3**). Basalt is a  
269 volcanic rock primarily composed of plagioclase feldspar, pyroxene, olivine, and  
270 sometimes magnetite. The automated analysis of the sample suggests a strong presence  
271 of forsterite and possibly inderite and scolecite. Olivine minerals such as forsterite, and  
272 zeolite minerals like scolecite, which can form in vesicles within basalt, are valid results  
273 for the sample. To interpret the matching results, it is important to take into the laser  
274 beam size, which is controlled by the objective lens magnification, and the measured

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275 grain size. While the peak at  $422\text{ cm}^{-1}$  matches well with many minerals, forsterite is  
276 not listed among the top 3 matches. However, the *Raman Match* allows a closer  
277 examination of the Forsterite reference data, and the output results spreadsheet suggests  
278 that forsterite could be a better match, as the sample spectrum also matches other  
279 characteristic peaks of forsterite. Similarly, the peak at  $605\text{ cm}^{-1}$  is labelled as Titanite,  
280 but the bar graphs also show a match to Scolecite as well, which in more appropriate  
281 considering the common minerals found in Hawai'i (De Carlo & Swoboda, 2017). The  
282 other minerals are not expected in pure basalt and may be traces of the surrounding  
283 laboratory materials at the University of Hawai'i. In **Figures 4 & 5**, examples of guided  
284 and unguided matching are showcased for unoriented crystals of calcite and quartz,  
285 respectively. **Figure 4** shows accurate matching of the calcite reference files with the  
286 two selected peaks. **Figure 5** shows that quartz is 100% match for each of the selected  
287 peaks, as it was included in the user's input of elements to "Look for".

288 Users can easily review the identified minerals, peak locations, and associated  
289 information, which allows verification of the software's performance. The software also  
290 includes error handling mechanisms to deal with unexpected scenarios and if any issues  
291 or anomalies are encountered during the analysis, the software generates informative  
292 error messages. This feature ensures that users are alerted to potential problems, such  
293 as incorrect file format loaded or no available matches. In case errors occur during the  
294 matching process, the process is terminated, and the "Match" button becomes available  
295 to use. Finally, the software is accompanied by detailed documentation, in the  
296 Instruction tab and in the application package, that explains its functionality, usage, and  
297 potential troubleshooting steps. Users can reach out to the corresponding author for

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298 support to address any questions or concerns. A flowchart summarizing the tools  
299 available for the user is illustrated in **Figure 6**.

300

### 301 **Implications**

302         The *Raman Match* application represents a significant advancement in the realm  
303 of Raman data analysis, offering a versatile open-source platform that streamlines the  
304 intricate tasks of data processing, peak identification, and mineral and chemical  
305 recognition. Based by the flexibility and robustness of Python and its associated  
306 libraries, this software introduces a user-friendly interface, ensuring that researchers  
307 can navigate and interpret Raman spectra with remarkable ease and efficiency. Beyond  
308 its intuitive interface, the application boasts interactive features, synchronization  
309 capabilities, and visually informative representations that not only simplify the  
310 analytical process but also enrich the user experience.

311         This software holds promise as a valuable tool beyond the laboratory setting,  
312 such as in space missions, where the instantaneous analysis of Raman data can  
313 significantly enhance mission efficiency. Raman spectroscopy may be utilized to  
314 identify mineral compositions on distant celestial bodies or to assess the composition  
315 of materials encountered during space exploration (Cho et al., 2021; Edwards et al.,  
316 2021; Hickman-Lewis et al., 2022; Rull et al., 2017, 2022). In such missions, time is  
317 often of the essence, and the ability to analyze Raman data rapidly and accurately can  
318 be critical. The compatibility of *Raman Match* with rover-based instrumentation or  
319 handheld Raman spectrometers, as a simple Python-based code, can empower  
320 astronauts or researchers on-site to rapidly analyze encountered materials and make  
321 informed decisions without the delay of sending samples back to Earth for analysis.

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322 *Raman Match's* capacity to automate and expedite the analysis process positions it as  
323 an indispensable asset for real-time decision-making. In addition, *Raman Match* has the  
324 capability to catalyze breakthroughs in various scientific fields heavily reliant on home-  
325 built Raman spectroscopy systems, including materials science, chemistry, and  
326 pharmaceutical analysis. By simplifying the analysis workflow and offering automated  
327 chemical and mineral identification features, this software empowers researchers to  
328 delve deeper into the intricacies of their studies. For instance, *Raman Match's* ability to  
329 automate analysis processes aligns with the increasing need for autonomous exploration  
330 tools in remote and challenging environments. Modifications and improvements are  
331 continuously monitored by the corresponding author, such as implementation of the  
332 recently published NASA Raman database (Mattioda et al., 2023). The source code for  
333 *Raman Match* is made available, and users are encouraged to implement their own  
334 preferences and contribute to the software's development.

335

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345            *RamanMatch.exe* may be operated on Windows without additional system  
346 requirements, while the source code may be operated across platforms including  
347 macOS and Linux. The source code relies on various Python libraries and packages,  
348 including NumPy, SciPy, Matplotlib, Pandas, Tkinter, OpenPyXL, and Wofz. Users  
349 running the source code, instead of the executable file, should have these dependencies  
350 installed to run the software successfully. The source code programming language is  
351 Python, written in English, and published under the GNU GENERAL PUBLIC  
352 LICENSE by Meryem Berrada. All relevant documents are available from September  
353 26<sup>th</sup>, 2023, on GitHub: <https://github.com/meryemberradauwo/RamanMatch>.



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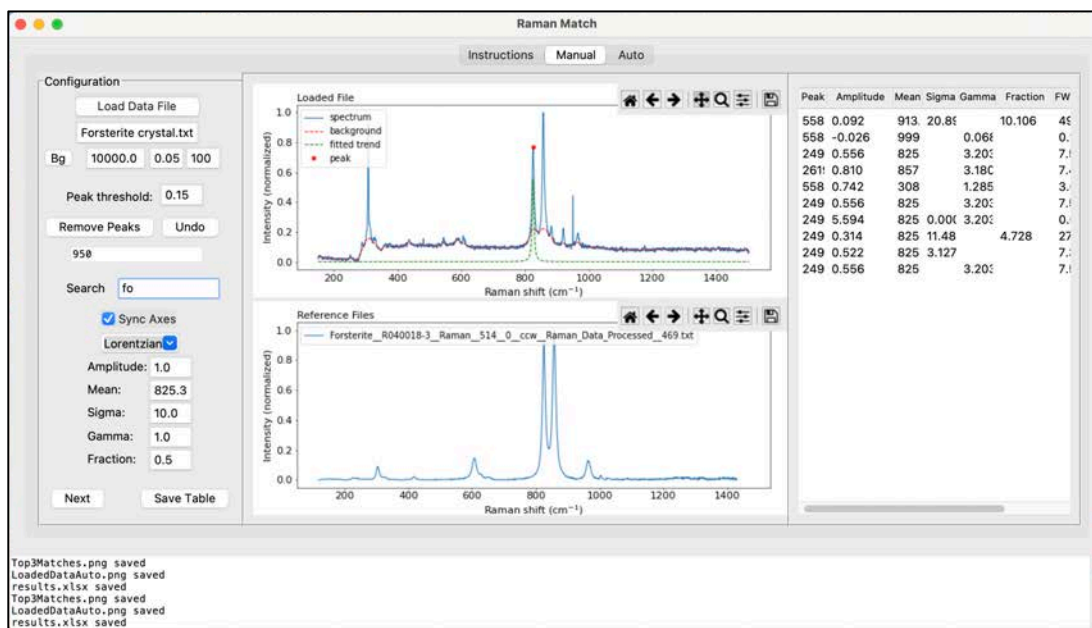
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## 537 LIST OF FIGURE CAPTIONS

- 538 **Figure 1:** Manual tab - Example of experimental data analysis on an unoriented  
539 forsterite crystal. The top figure displays the experimental data. The bottom  
540 figure displays the reference file taken from the search bar linked to the  
541 RRUFF database. The table on the right-hand-side dynamically displays the  
542 fitting results. Each figure is equipped with a toolbox allowing the user to  
543 interact with the figure. The area at the bottom of the software dynamically  
544 displays error messages or updates.
- 545 **Figure 2:** Auto tab - Example of experimental data analysis on an unoriented forsterite  
546 crystal. The top figure displays the experimental data. The bottom figure  
547 displays the top three reference files from the RRUFF database. The figure  
548 on the right-hand-side displays the matching results for each identified peak.  
549 Each figure is equipped with a toolbox allowing the user to interact with the  
550 figure. The area at the bottom of the software dynamically displays error  
551 message or updates.
- 552 **Figure 3:** Example of automated analysis on a Hawaiian vesicular basalt collected in  
553 Oahu showing strong forsterite peaks, with traces of possibly inderite and  
554 scolecite.
- 555 **Figure 4:** Example of automated analysis without guidance by the user on a calcite  
556 crystal. The matching process identified calcite as the best match.
- 557 **Figure 5:** Example of automated analysis with guidance by the user on a quartz crystal.  
558 The matching process identified quartz as the best match as expected.
- 559 **Figure 6:** Summary of the interactive tools available for the user in the “Manual” and  
560 “Auto” tab. The instruction tab provides the user with a similar description  
561 of events.

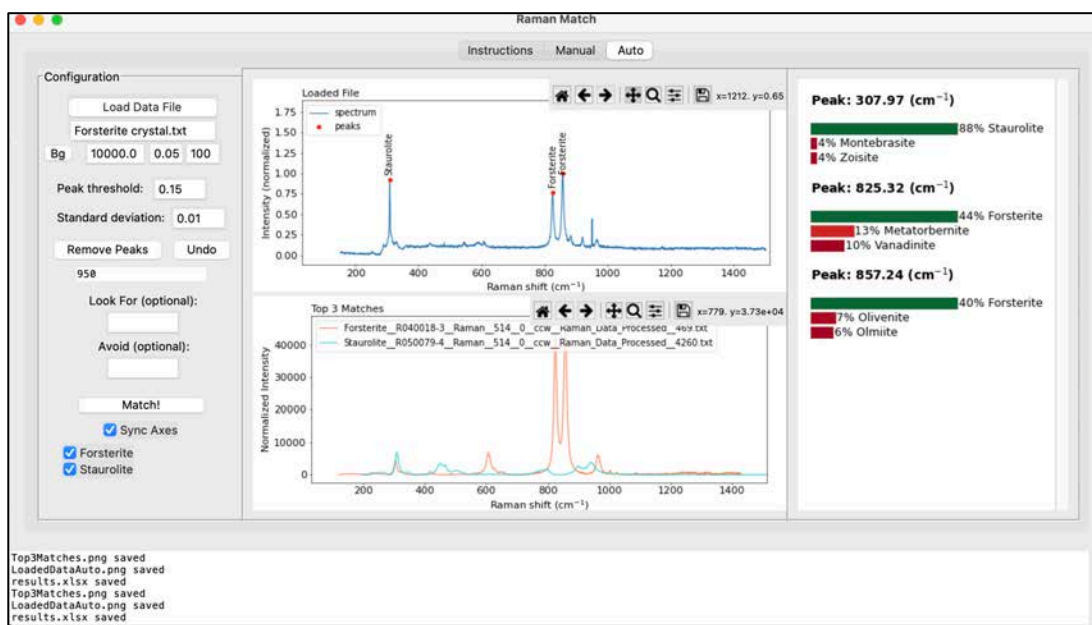
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562 **Figure 1:**



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564 **Figure 2:**

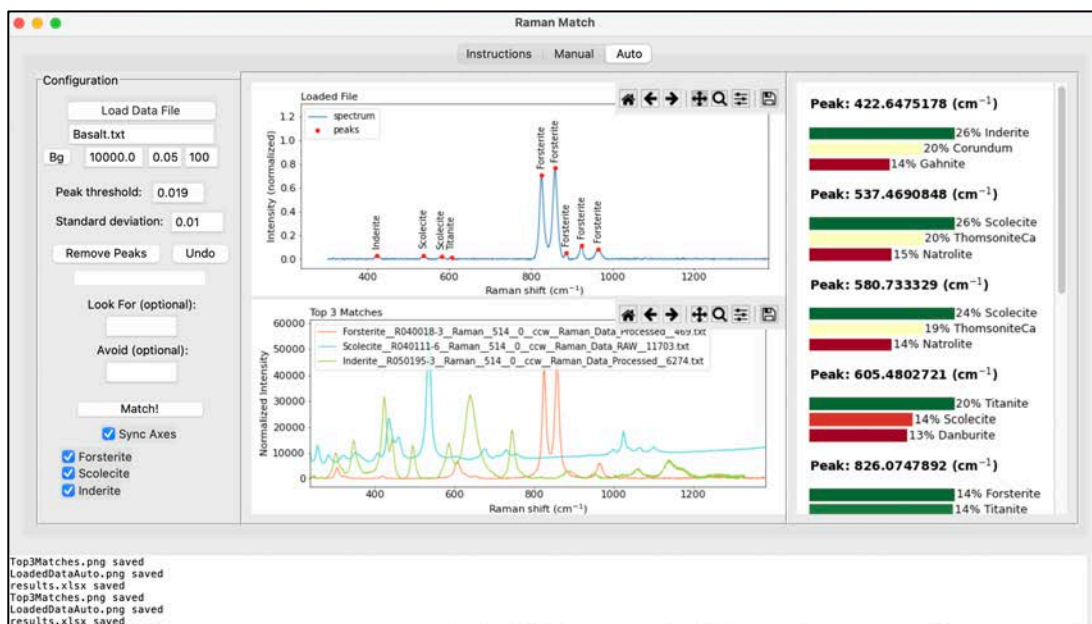


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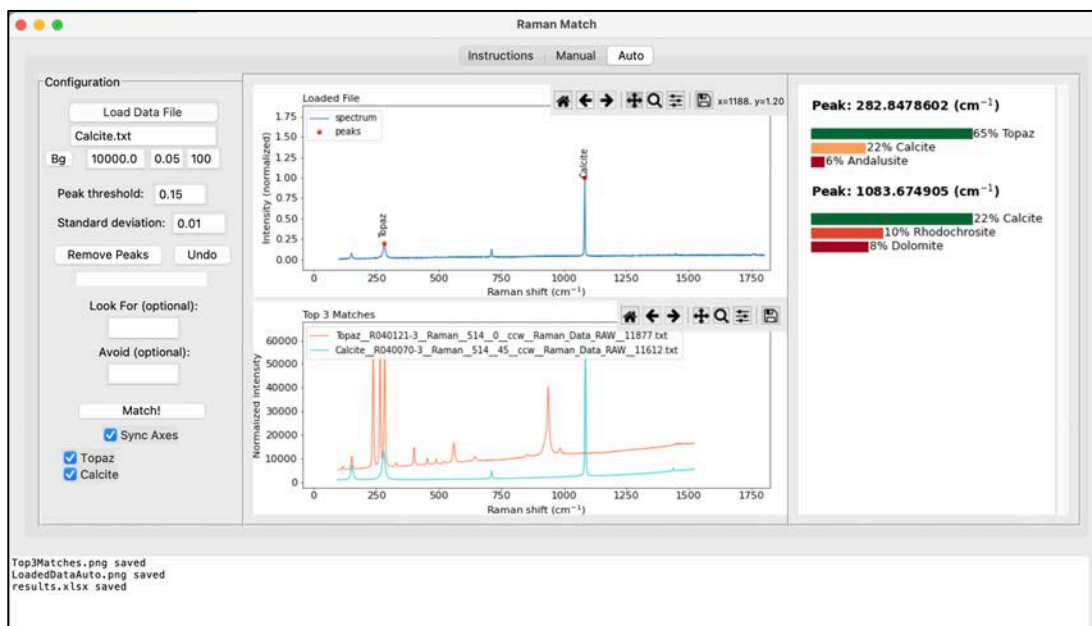
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567 **Figure 3:**



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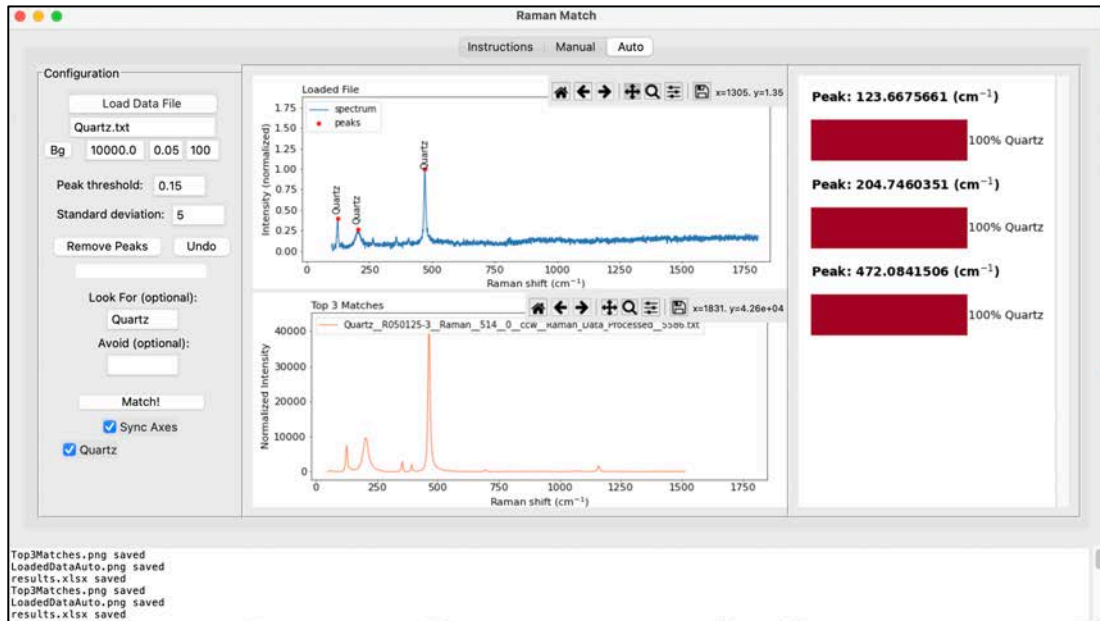
569 **Figure 4:**



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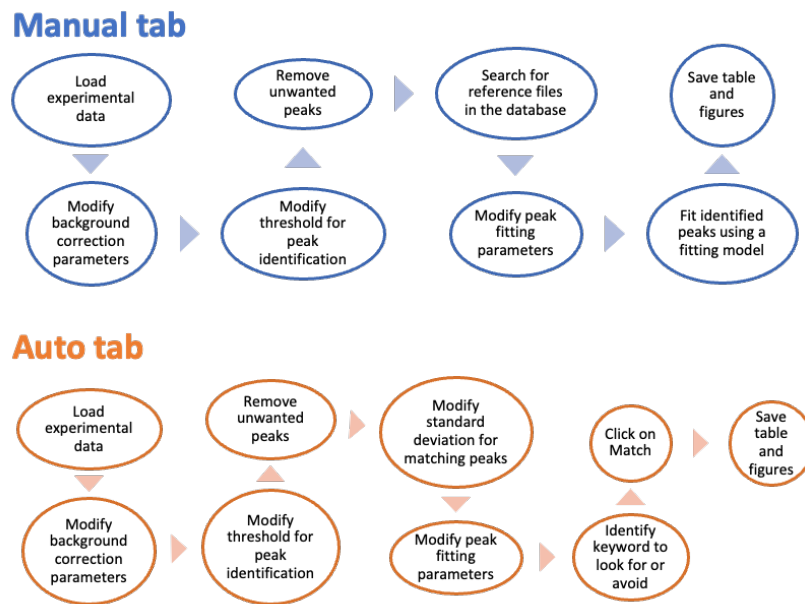
Revision 2

571 **Figure 5:**



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573 **Figure 6:**



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