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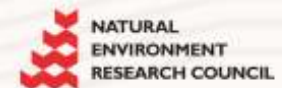
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Mapping mine waste using hyperspectral imaging spectrometry data

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Context



- A long history of mining in the UK has left a legacy of waste in various forms.
- Certain minerals present within this waste are harmful to people and the environment.
- Governments, Agencies and Industry need a cost effective way of mapping mine waste

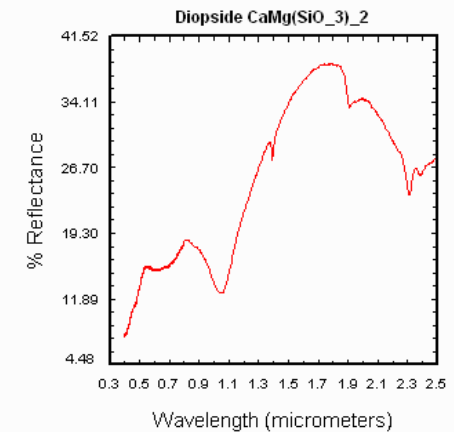
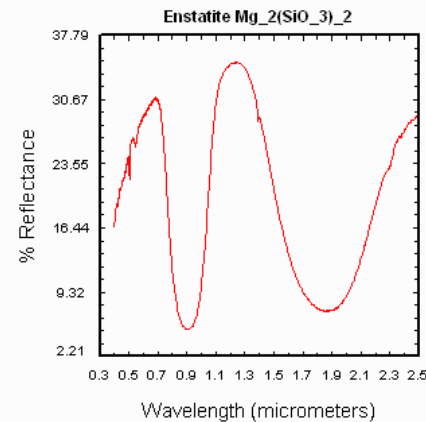
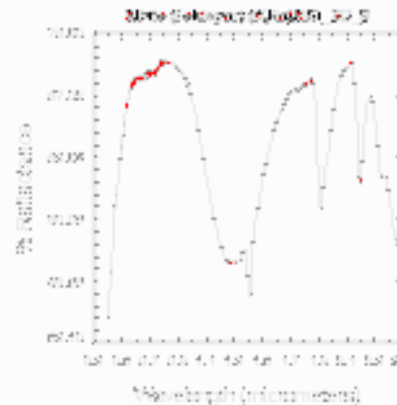
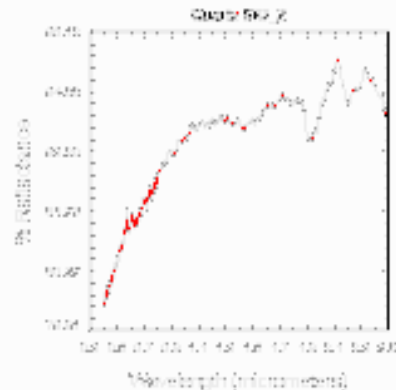
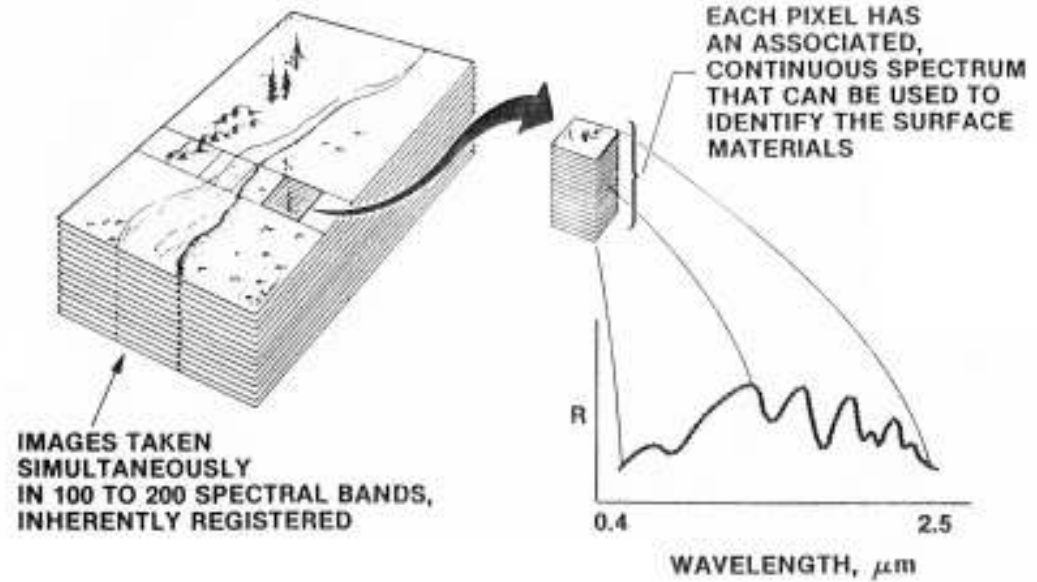
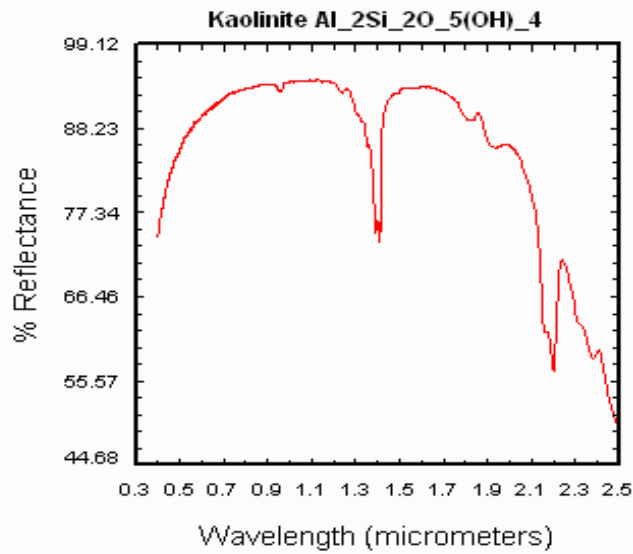


Remote Sensing

- **Minerals can be mapped remotely using hyperspectral airborne remote sensing.**
- **Mine waste will contain characteristic minerals which can be mapped**
 - **Faster**
 - **Cheaper**
 - **Safer**
 - **Non-invasively**



HYPERSPECTRAL MINERAL MAPPING





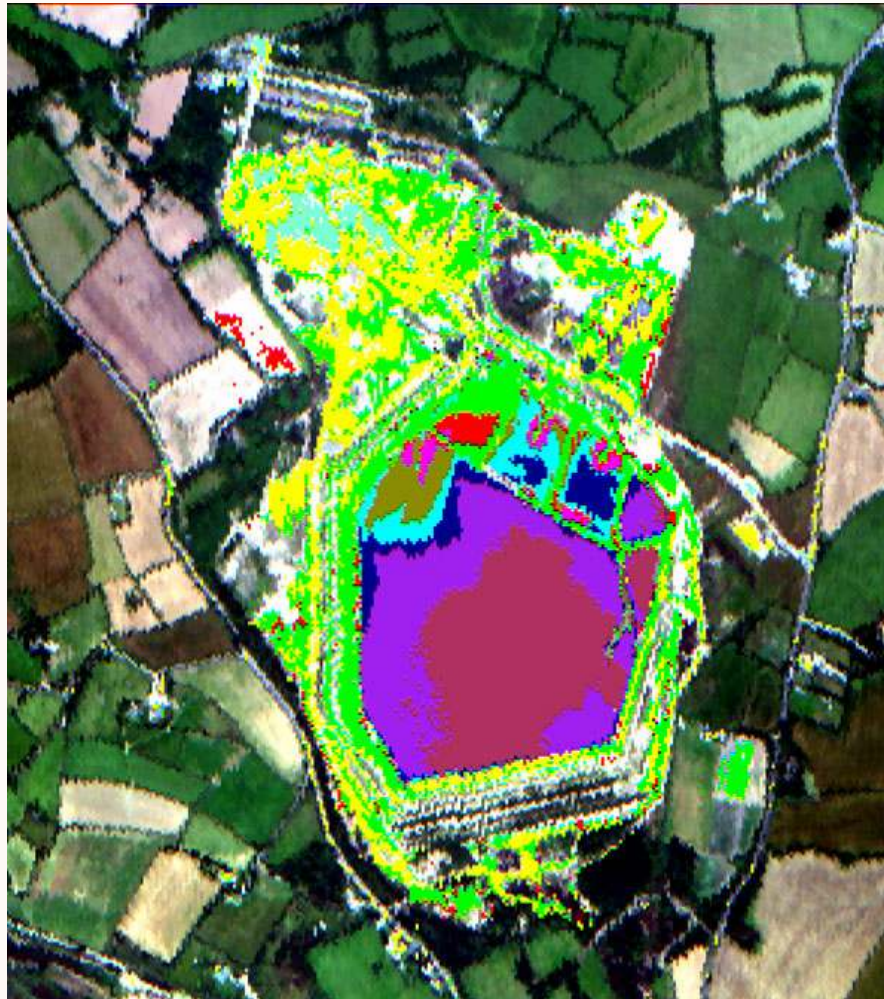
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Previous Studies - MINEO



- MINEO was an EC 5th Framework R & D project
- The aim was to develop and test Hyperspectral data analysis tools in a European context
- Focusing on mine pollution rather than mineral exploration
- Work in a populous, temperate environment, rather than arid conditions



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Introduction – Parys Mountain

- Parys Mountain copper mine has a unique variety of lithologies and minerals, flora and fauna
- Sites of Special Scientific Interest (SSSI)
- Weathering is harsh with sulphuric acid generated by the oxidation of pyrite and other sulphide minerals
- This process results in colourful red and yellow Iron oxides and sulphate minerals
- It is this diversity of minerals and weathering products that make this site so challenging to characterize and map



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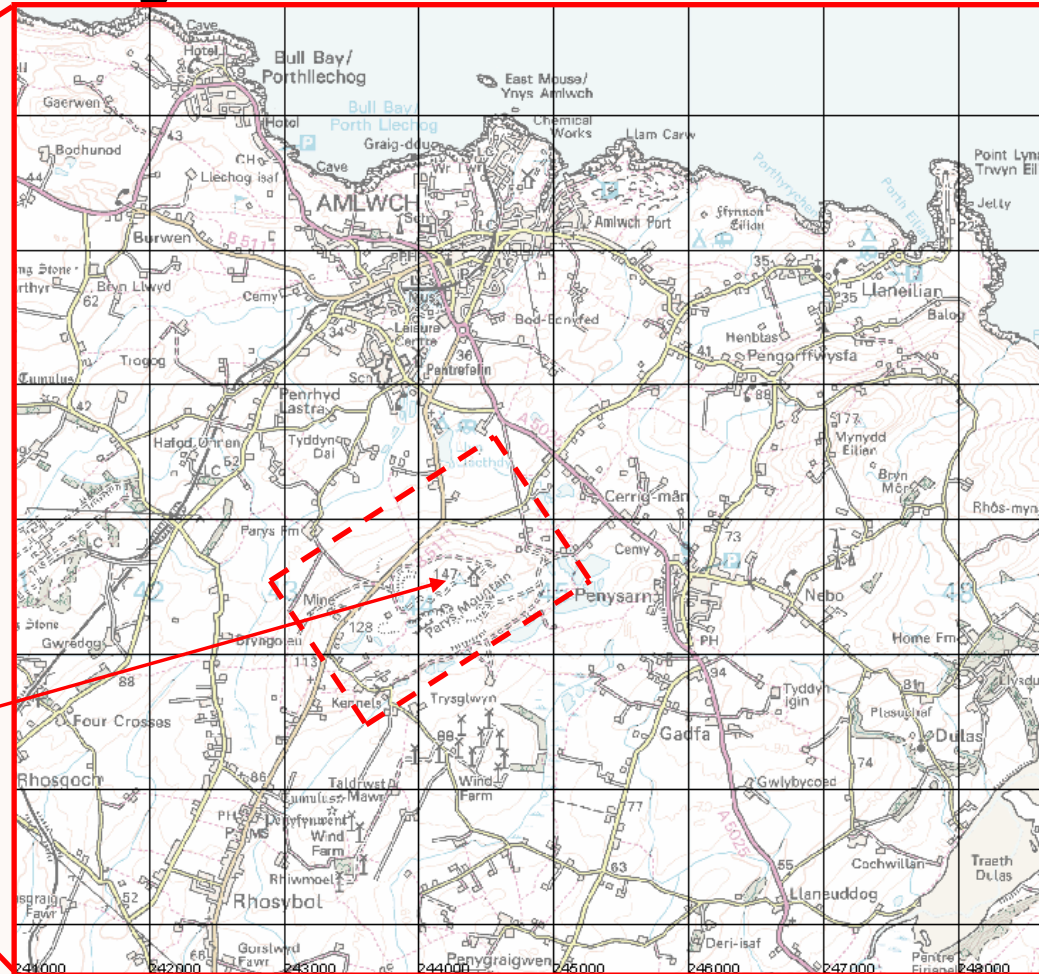


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Study Site



Parys Mountain





Geology



- Mineralisation at Parys Mountain extends 3km NNE-SSW in a 1 km wide band
- Primary mineralisation resulted from exhalative volcanic-sedimentary mineralisation in the late Ordovician
- A secondary phase remobilization occurred during the Caledonian metamorphism
- The lodes themselves are zones of maximum chalco-pyritisation, and would have been formed during the great Post-Silurian Caledonian earth-movements



Mining History



- Mining began in the Bronze age
- Beach pebbles used as hammers
- Crushed ore smelted, mixed with tin to make bronze objects
- Main period of mining began in 18th Century
- Left landscape devoid of vegetation



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HyMap Data

Sensor used is HyMap

- Hyperspectral Airborne Scanner
- 126 Bands
- Wavelength region 0.45 - 2.5 μm
- Bandwidth between 15 and 20 nm
- Pixel size between 3 and 10 m
- Owned and operated by HyVista
- Data flown as part of SHAC project





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Methodology



- **Atmospheric correction - ATREM**
- **End member selection**
- **Minimum Noise Fraction (MNF)**
- **Pixel Purity Index (PPI)**
- **2-D scatter plots**



Methodology








- Visual Inspection of end members
- Comparison with field spectra
- SAM classification
 - Physically based spectral classification
 - Uses n-dimensional angle to match pixels
 - Algorithm calculates the angle between spectra



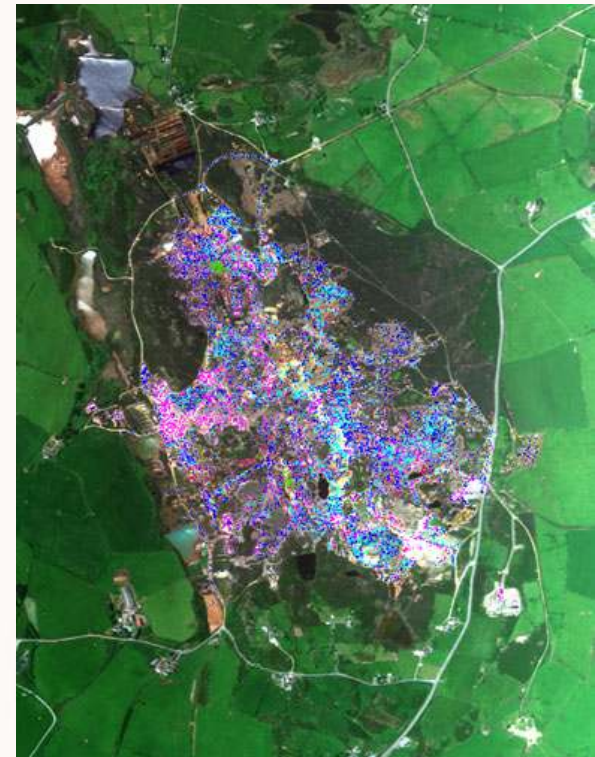
Parys Mountain - Results

Spectral Interpretation of mine waste at the Parys Mountain Mine on Anglesey



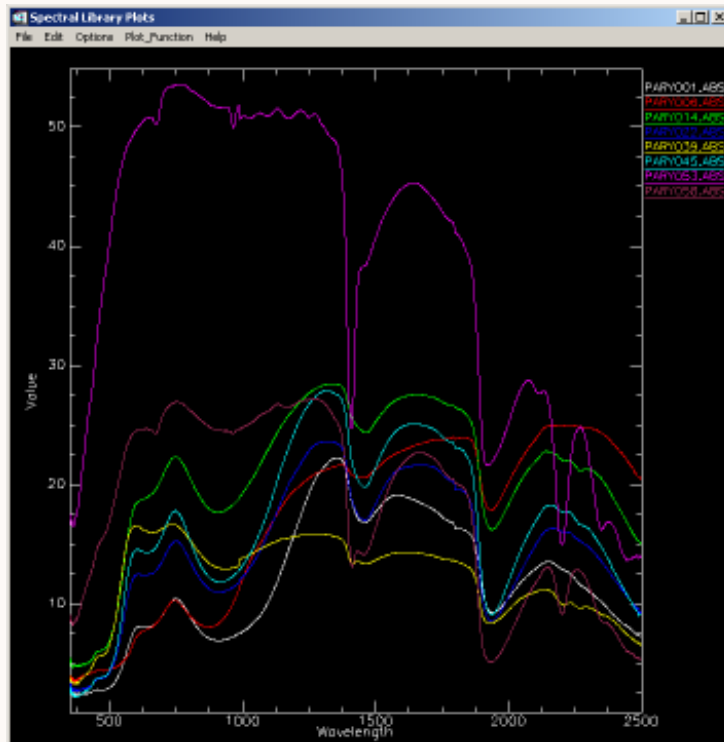
	Jarosite & goethite
	Jarosite & hematite
	Jarosite
	Muscovite and albite
	Albite and goethite

Mine waste of differing
mineralogy can be
mapped using
hyperspectral imagery



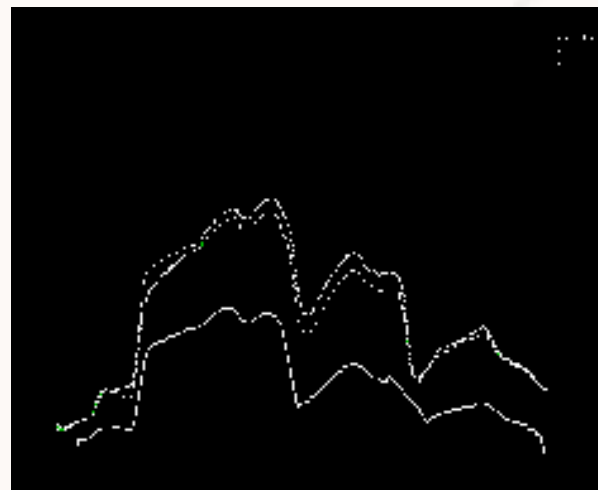


Field Spectra



- Spectral library developed
- Characterise tailings
- XRD analysis
- Other materials measured
 - Tarmac
 - Concrete

➤ **Vegetation**



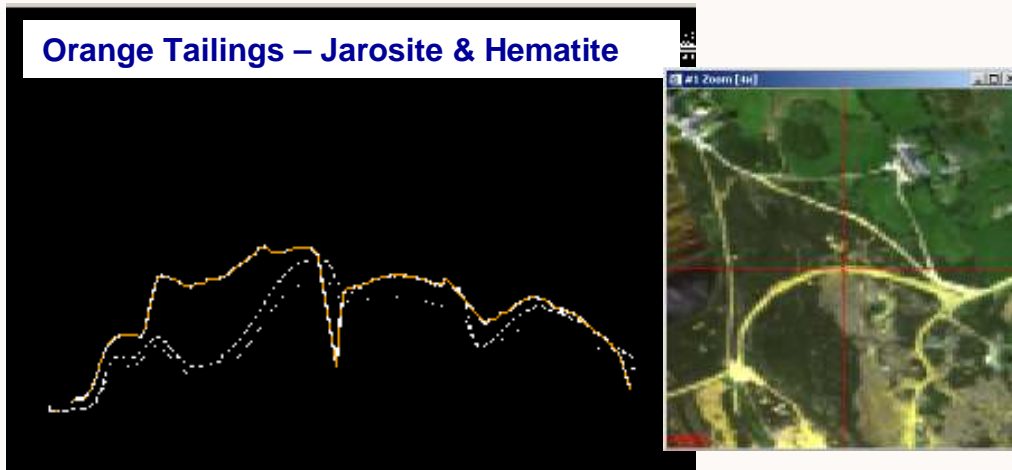


Verification

Red Tailings – Jarosite & Goethite



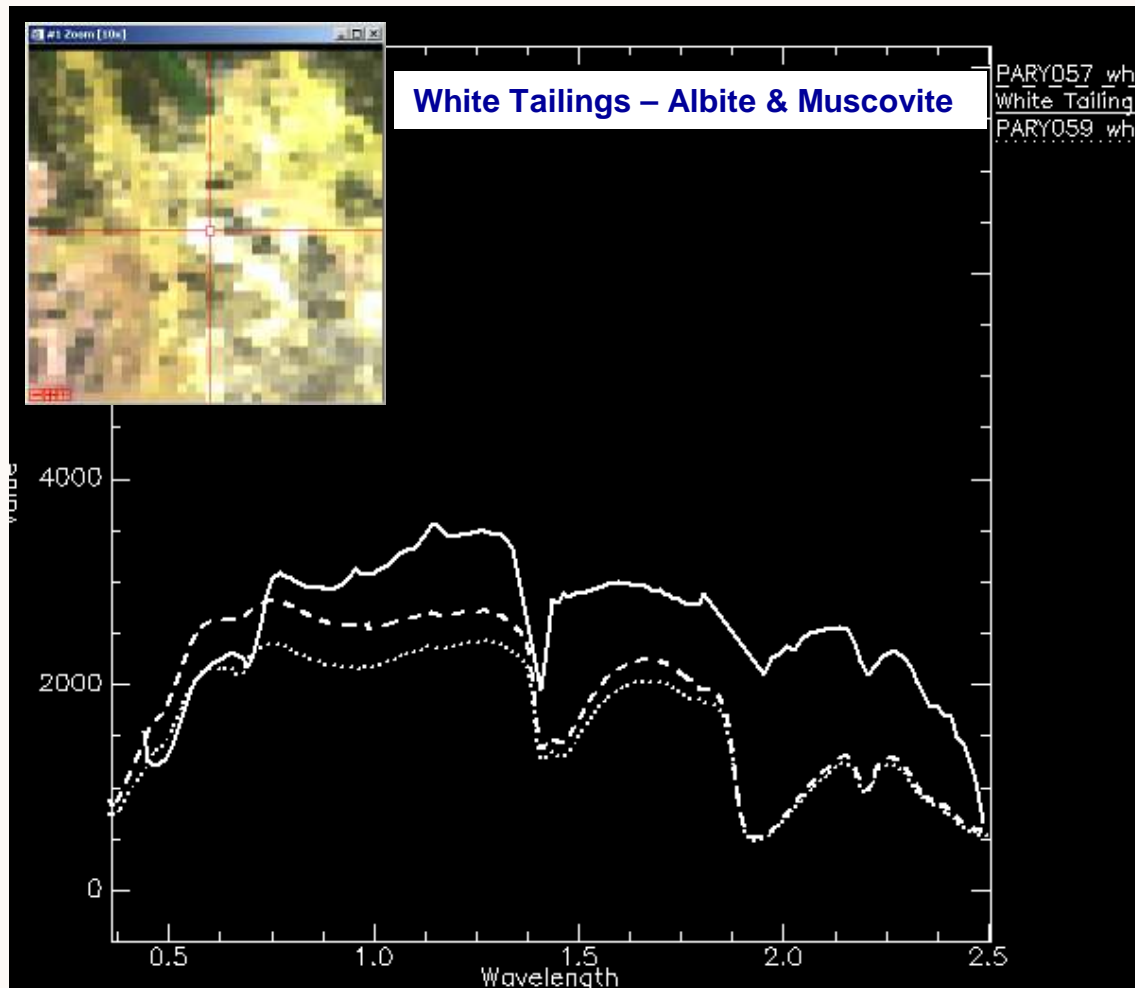
Orange Tailings – Jarosite & Hematite



- USGS pure mineral spectra gave spurious results
- Field spectra gave much better verification results
- Spectral feature fitting and visual analysis



Verification



- Feature at 1410nm
- Feature at 2206nm
- Consistent with muscovite
- Other features in the spectrum do not match
- Mixing of minerals
- Comparisons between field and image spectra show strong correlation



Conclusions

- **Pure mineral spectra from a commercially available spectral library don't always match image spectra**
- **Field spectra can be used much more effectively to develop a site-specific spectral library**
- **Characterisation and verification of classifications can then be based on these reference spectra**
- **Further verification can then be carried by undertaking geochemical analysis**
- **A suite of “materials” of interest can then be built up to produce a site-specific spectral library.**



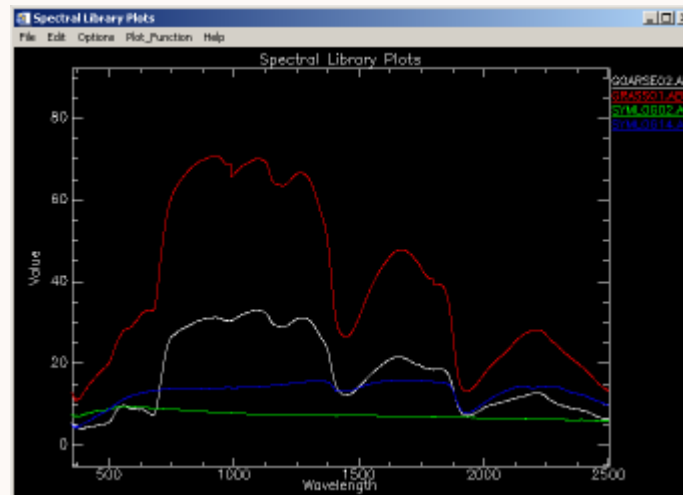
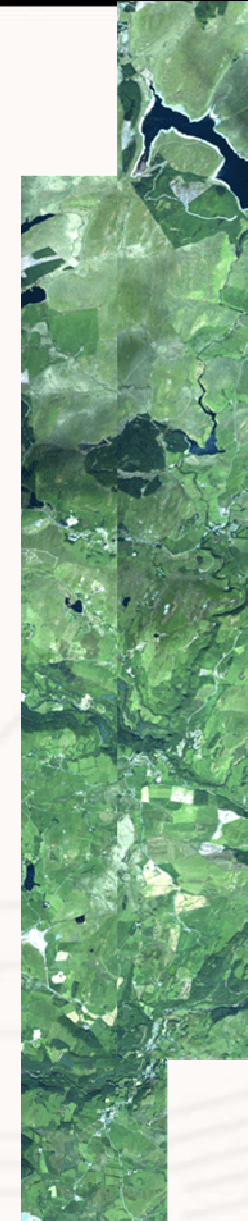
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Rheidol Valley





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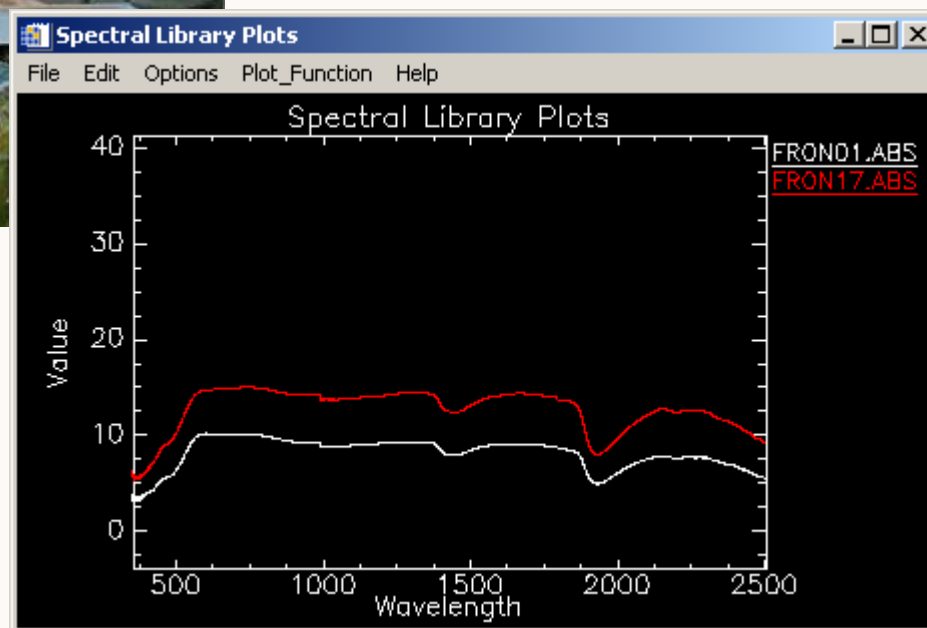


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Frongoch Mine field spectra





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