

Identification of *Jacobs Cross Cabbage* within Kitchen Herbs Parsley and Thistle

Christian Felsheim



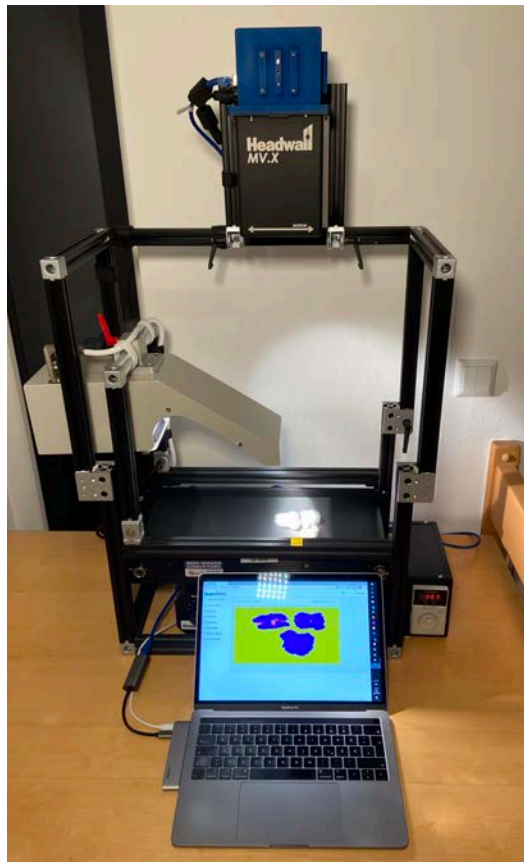
Challenge

[Jacobs Cross Cabbage](#) (*Jacobaea vulgaris*) is a very common flower that is native to northern Eurasia. The flower contains liver toxic [Pyrrolizidine alkaloids](#) which makes it an unwanted plant for farmers who need to separate it out from harvested kitchen herbs such as parsley.

Current tests are intended to identify dried *Jacobs Cross Cabbage* online within dried samples of parsley and thistle using a [Headwall MV.X](#) VNIR Hyperspectral System running [perClass Mira](#) Runtime software on the processors embedded in the *MV.X* system.



Test Setup



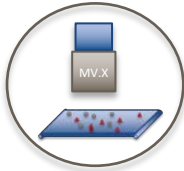
- MV.X Hyperspectral Imaging System
VNIR : 400 – 1000nm, 16mm lens
- Headwall lab kit halogen light
- Mini conveyor belt
- perClass Mira Analysis and Runtime Software
- Dried samples of Jacobs Cross Cabbage, Parsley and Thistle



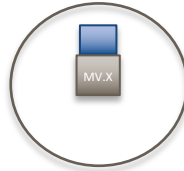
Process

Preparation

Record Training Data (inline)



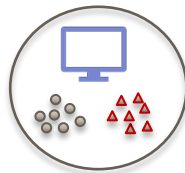
Program MV.X



Download Raw Data



Upload Classification Model



Create Classification Model (offline)



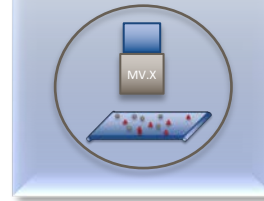
Operation



Cloud



Inline Classification and Grating



Actionable Results



Continued Performance Control and Optimization through WebInterface (remote)



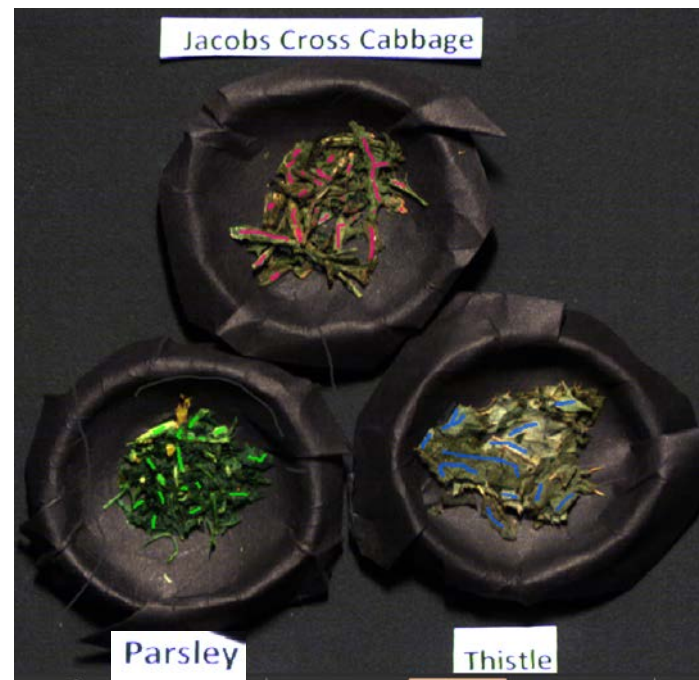
Ethernet Connection



Model Build in *perClass Mira* Analysis Software

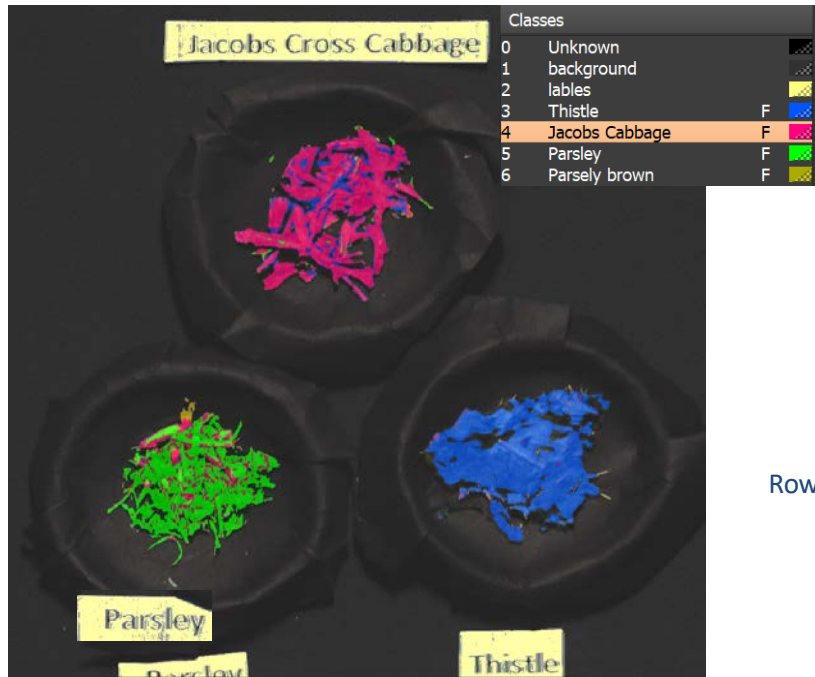


RGB Image



Labelled RGB Image

Classification and Confusion Matrix



Classified Result

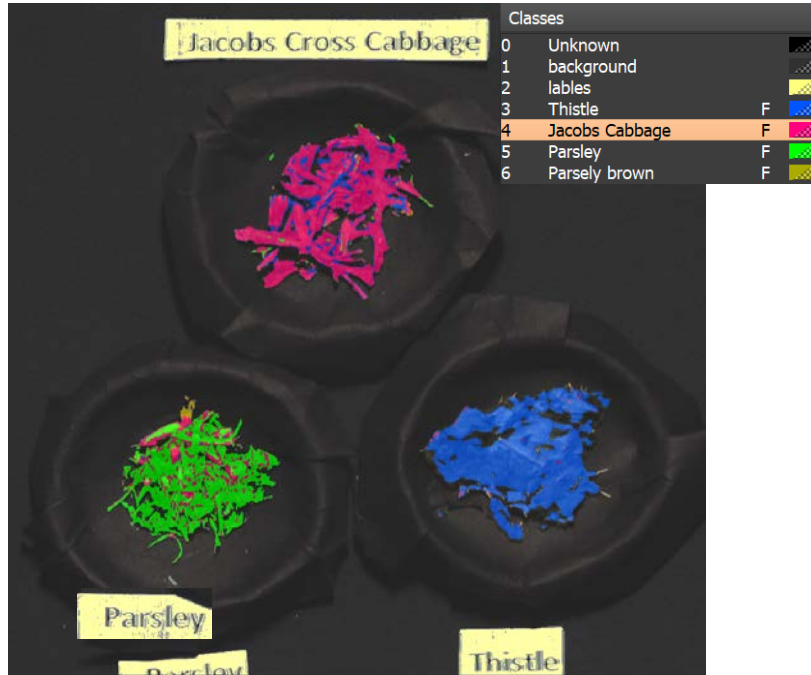
Columns: Decisions

| | 1 backgro | 2 lables | 3 Thistle | 4 Jacobs | 5 Parsley | 6 Parsely | Class error |
|-------------|--------------|-------------|--------------|-------------|--------------|--------------|-------------|
| 1: backgro | 0.998 | 0.000 | 0.001 | 0.000 | 0.001 | 0.000 | 0.002 |
| 2: lables | 0.000 | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| 3: Thistle | 0.030 | 0.000 | 0.970 | 0.000 | 0.000 | 0.000 | 0.030 |
| 4: Jacobs C | 0.000 | 0.000 | 0.103 | 0.873 | 0.016 | 0.009 | 0.127 |
| 5: Parsley | 0.029 | 0.000 | 0.001 | 0.016 | 0.954 | 0.000 | 0.046 |
| 6: Parsely | 0.015 | 0.000 | 0.000 | 0.103 | 0.000 | 0.882 | 0.118 |
| Precision | 0.98 | 1.00 | 0.90 | 0.98 | 0.96 | 0.90 | 0.054 |
| | | | | | | | Mean error |

Rows: True data

Confusion Matrix provides measure for correct classification

Optimization for Not-Missing *Jacobs Cross Cabbage* (JCC)



Classified Result

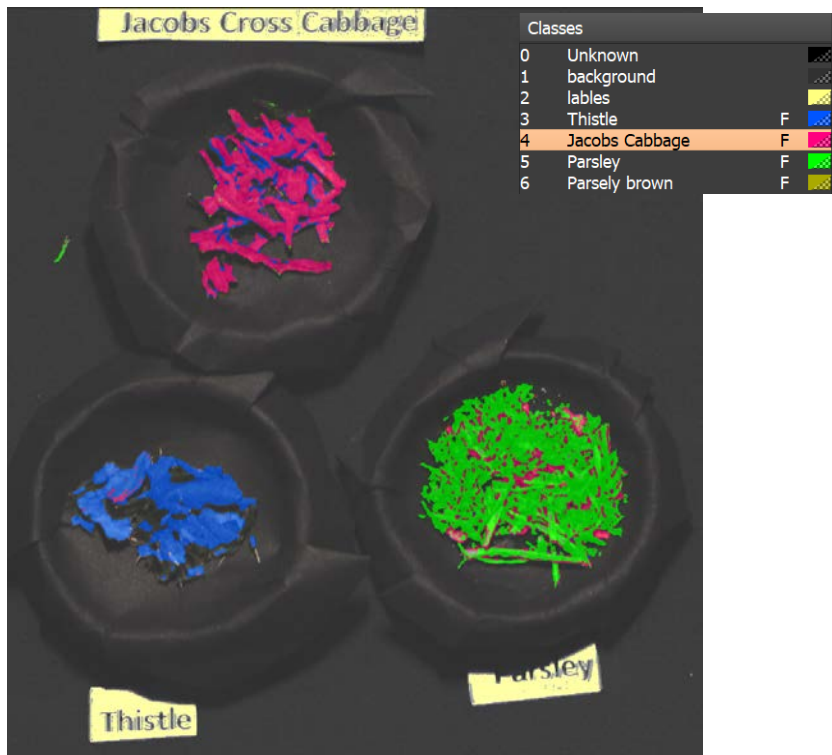
| | 1 backgro | 2 lables | 3 Thistle | 4 Jacobs | 5 Parsley | 6 Parsely | Class error |
|-------------|--------------|-------------|--------------|-------------|--------------|--------------|-------------|
| 1: backgro | 0.996 | 0.000 | 0.000 | 0.001 | 0.003 | 0.000 | 0.004 |
| 2: lables | 0.000 | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| 3: Thistle | 0.047 | 0.000 | 0.887 | 0.066 | 0.000 | 0.000 | 0.113 |
| 4: Jacobs C | 0.000 | 0.000 | 0.004 | 0.987 | 0.007 | 0.001 | 0.013 |
| 5: Parsley | 0.010 | 0.000 | 0.000 | 0.045 | 0.945 | 0.000 | 0.055 |
| 6: Parsely | 0.010 | 0.000 | 0.000 | 0.446 | 0.000 | 0.544 | 0.456 |
| Precision | 0.97 | 1.00 | 0.99 | 0.88 | 0.97 | 0.97 | 0.107 |
| | | | | | | | Mean error |

Jacobs cross Cabbage

Brown parsley leaves

Confusion Matrix Constraint set for likelihood of missing JCC about 1%
=> Accepted increase in false hit for JCC in brown parsley leaves

Test of Classification Model with 2nd Probe



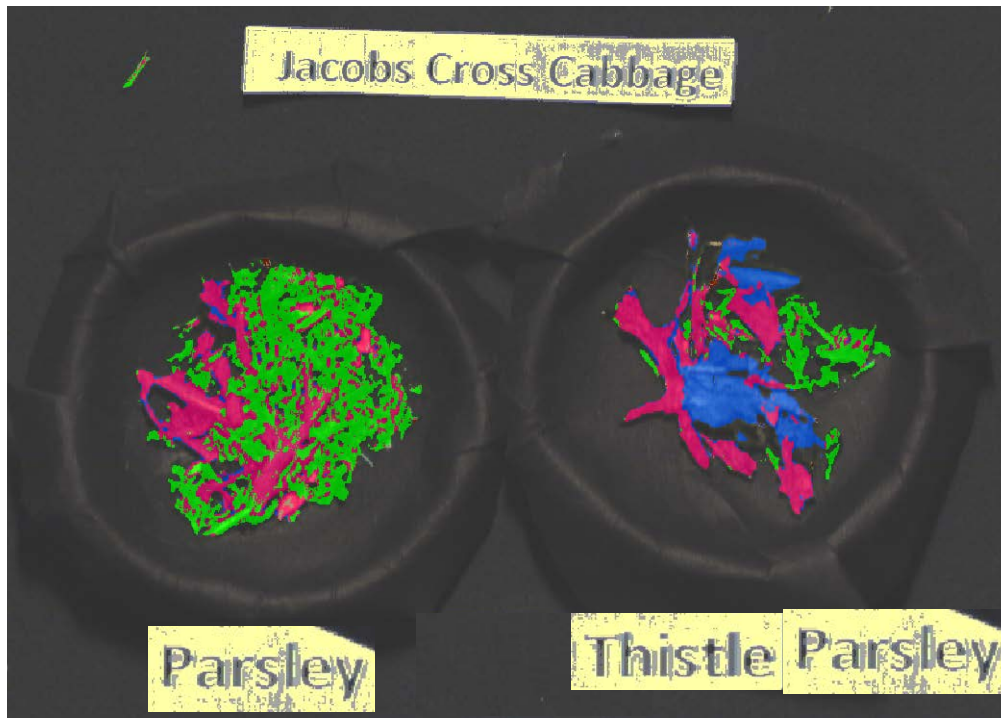
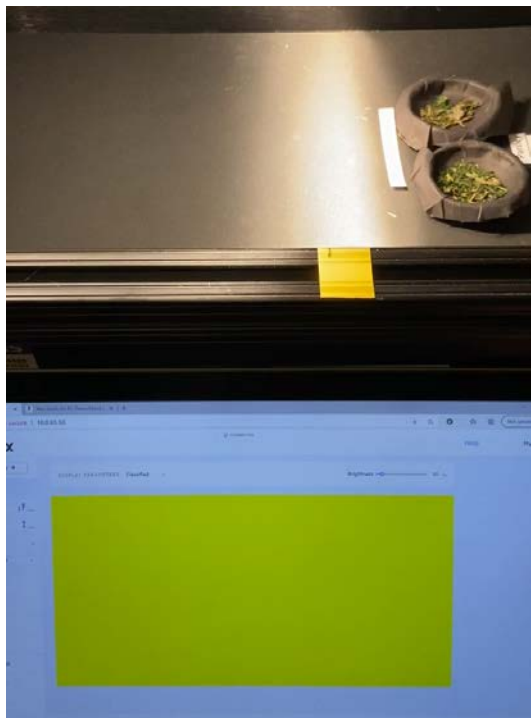
| | 1 backgro | 2 labes | 3 Thistle | 4 Jacobs | 5 Parsley | 6 Parsely | Class error |
|--------------|--------------|------------|--------------|-------------|--------------|--------------|-----------------|
| 1: backgro | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| 2: labes | 0.000 | 1.000 | 0.000 | 0.000 | 0.000 | 0.000 | 0.000 |
| 3: Thistle | 0.089 | 0.000 | 0.819 | 0.092 | 0.000 | 0.000 | 0.181 |
| 4: Jacobs C | 0.000 | 0.000 | 0.001 | 0.998 | 0.001 | 0.000 | 0.002 |
| 5: Parsley | 0.001 | 0.000 | 0.000 | 0.010 | 0.989 | 0.000 | 0.011 |
| 6: Parsely b | 0.286 | 0.000 | 0.095 | 0.202 | 0.000 | 0.417 | 0.583 |
| Precision | 0.98 | 1.00 | 0.99 | 0.90 | 1.00 | 1.00 | 0.130 |
| | | | | | | | Mean clas error |

Jacobs cross Cabbage

Brown parsley leaves

- Miss rate for Jacobs Cross Cabbage $\ll 1\%$
- False positive for Jacobs Cross Cabbage within brown parsley leaves 20%

Test using Mixed Probes



Conclusions

- Though dried material is inhomogeneous (lower and upper leaf sides, stem and leaves included), herbs can be differentiated at about **5% precision** level
- ***Jacobs Cross Cabbage (JCC)*** detection: At the expense on increased *false positive rate* on brown parsley leaves detection model can be optimized to reduce ***miss rates* for JCC to about 1% level**
- Model to be optimized for speed

MV.X Data Sheet



| | |
|-----------------------|---------------------------------|
| Wavelength Range | 400 – 1000 nm |
| Spatial Pixel | 1020 |
| Spectral Bands | 340 |
| Spectral Sampling | 1.75 nm/pixel |
| Spectral FWHM | 6 nm |
| System F/# | f/2.5 |
| Optical Design | Abberation-corrected concentric |
| Field of View | <i>Angular</i> |
| 24mm lens | 14.2° |
| 16mm lens | 21.16° |
| Bit Depth | 12 bit |
| Sensor Technology | CMOS |
| Memeroy Storage | 8GB RAM, 128GB SSD |
| Integrated Processors | GPU, CPU |

| | |
|------------------------|--|
| Interfaces | Gen<1>Cam MQTT RS232/422* 5V TTL* |
| Ports | RJ45 (GigE) x2 D-Sub 26 pin (GPIO) |
| Software | WebInterface, on-board classification module available |
| Memeroy Storage | 8GB RAM, 128GB SSD |
| Input Voltage | 12-30V DC |
| Max Power Consumption | < 42 W |
| Dimensions (LxWxH) | 255 x 136 x 136 mm |
| Weight incl. 24mm lens | 3 kg |
| IP Rating | IP66 / IP67 |
| Operating Temperature | 0 – 50°C |
| Storage Temperature | -10 – 60°C |

* in development





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