

Deciphering human emotion

Investigating Plant Electrical
Response to Eurythmy

Agenda

01

Plants Literature

02

Plant Response to Eurythmy

03

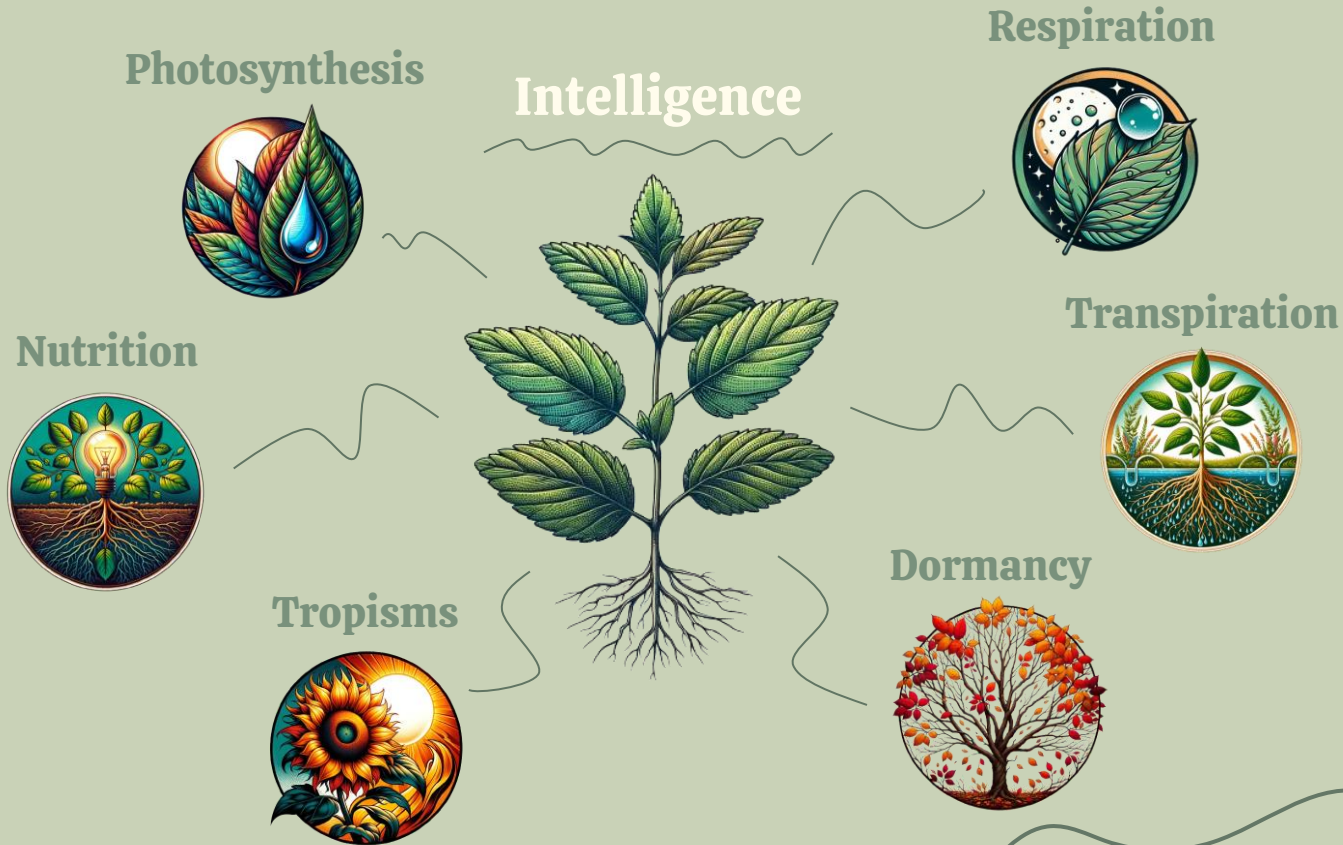
Future Research



01

**Plants
Literature**

What does a plant do?



Electrophysiology

Electrical Responses

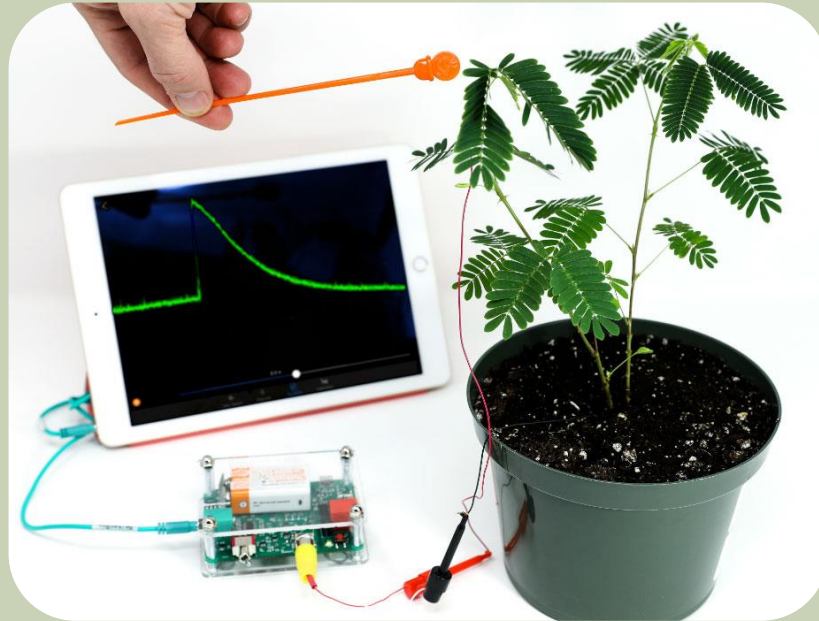
Sanderson, 1873

Pickard, 1973

Marzullo, 2012



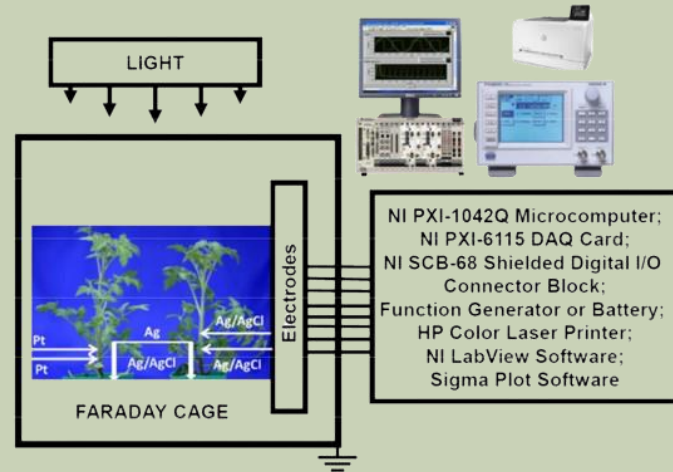
Plant Spikerbox



Communication

Volkov et al, 2019

1. Volatile Organic Compounds (chemicals)
2. Mycorrhizal Networks (fungi)
3. Rhizosphere (chemical)
4. Natural Grafting (merge roots)
5. Electrostatic or Electromagnetic
6. Acoustic
7. **Electrical Signal through the Soil**



Light Stimulus

Prediction from Electrophysiological Response

Chatterjee et al, 2014



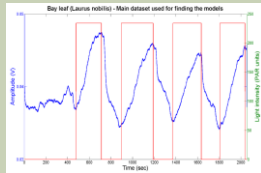
bay leaf



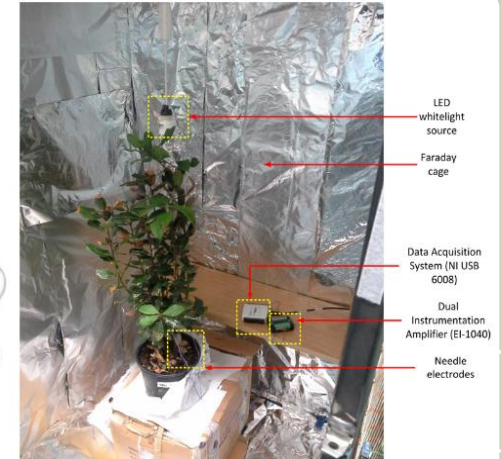
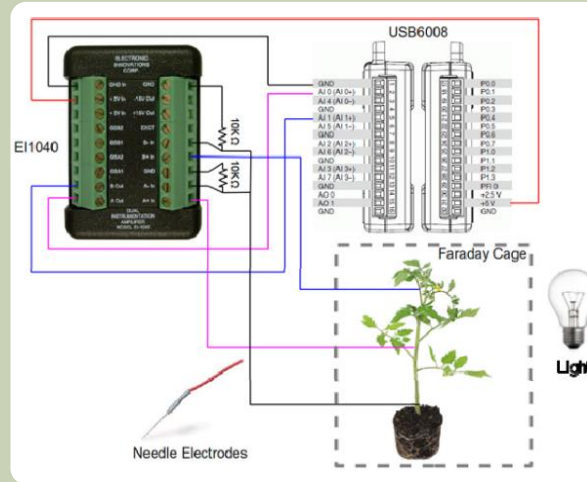
cucumber



zanzibar



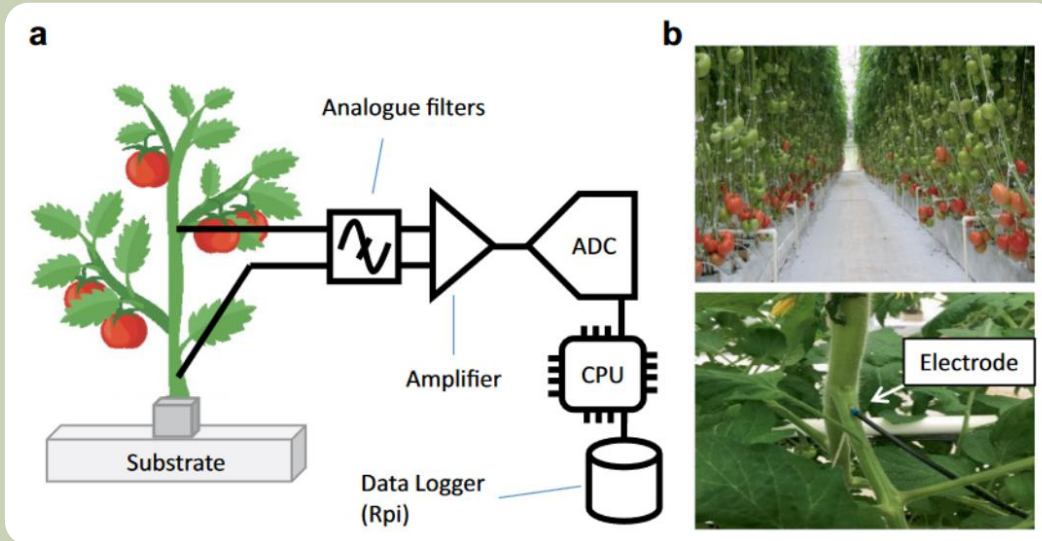
Photon
Flux
Density



Water status

By electrophysiological assessment

Tran et al, Nature 2019



Monitoring
2 weeks

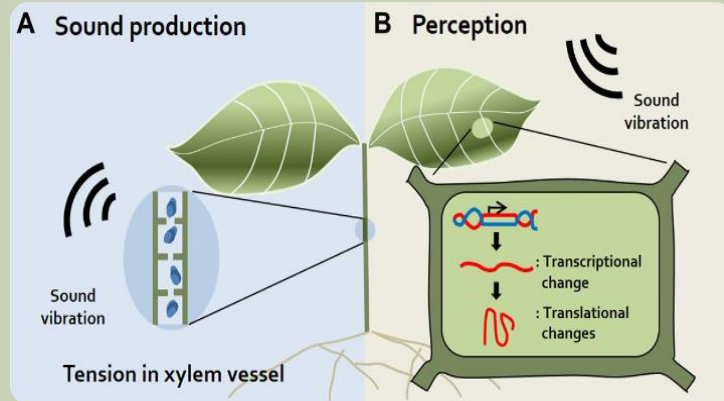
Output
Water Deficit

Accuracy
0.98

Sound Production

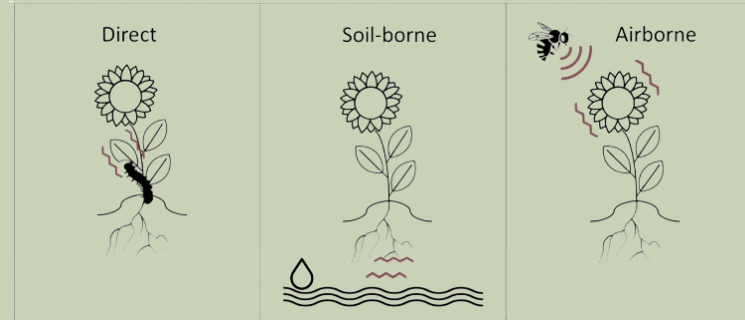
Jung et al, 2018

- Spontaneous sounds
- Gas bubbles in xylem vessels
- Audible and ultrasonic (20-105kHz)

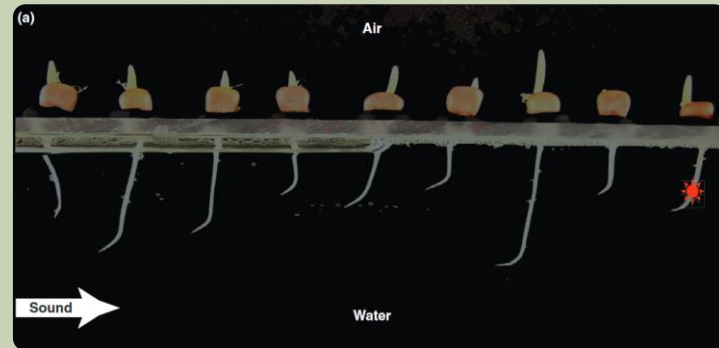


Perception

Khait et al, 2019



Gagliano et al, 2012



Music

Peter & Gloor, 2021



Location
Indoor greenhouse

Species
Dancing plant

Output
Control | 200 Hz | 600 Hz

Accuracy
0.72



02

**Plant Response
to Eurythmy**

Eurythmy



- Expressive movement art
- Originated by **Rudolf Steiner**
- Used in education, anthroposophic medicine, and in **Biodynamic agriculture**
- The melody is conveyed through expressing the **arm gestures** of the actual letters

How to Measure

Extracellular Recording

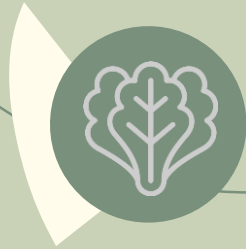
- Surface measurements (EEG)
- Total sum of bioelectrical activity in large groups of cells
- Placement of electrodes on the plant surface and soil

<https://backyardbrains.com/products/plantspikerbox>



Measurements

Salad



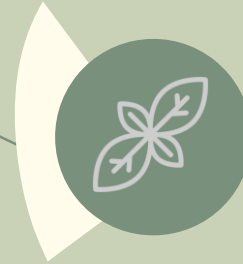
A-G-D

Tomato



A-G-D-O

Basil



A-G-D-L

Eurythmy Gestures
(4x times each)

Procedure



Eurythmy

The voltage of 3 plants is measured while an expert performs the eurythmy gestures on them



Control

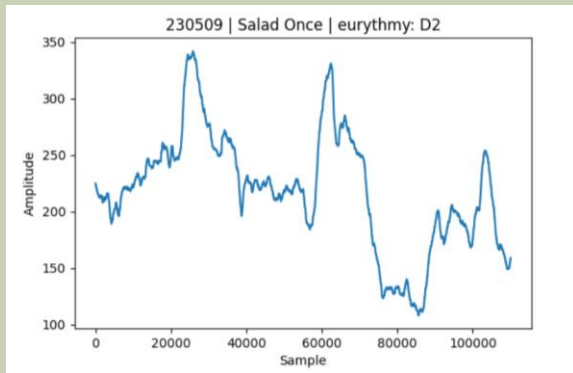
The tension of 3 plants far away from the expert but in the same orchard is measured

Data

108 eurythmy performances

(Apr 29 – Sep 30)

Wav



The Wav files are datapoints
and represent the plant
voltage over time

41 hours

Mp4



The Mp4 files help us to detect
the gesture and timing of
eurythmy

7 hours

Research Questions

01

Do plants react to eurythmy?

02

Do plants react differently to Eurythmy for the first time than when they are used to it?

03

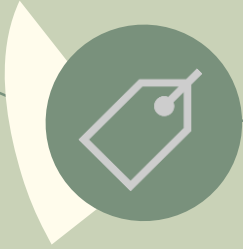
Do plants react differently between several eurythmy movements in a row?

04

Do plants react differently between different eurythmy gestures?

Data Preparation

Labelling



EDA



Cleaning



Input Approaches

01

Features

- Statistical
- Temporal
- Frequency

02

MFCCs

- FCNN
- CNN

03

Signal

- Dense Classifier
- LSTM Classifier

Featurization

Type of Features

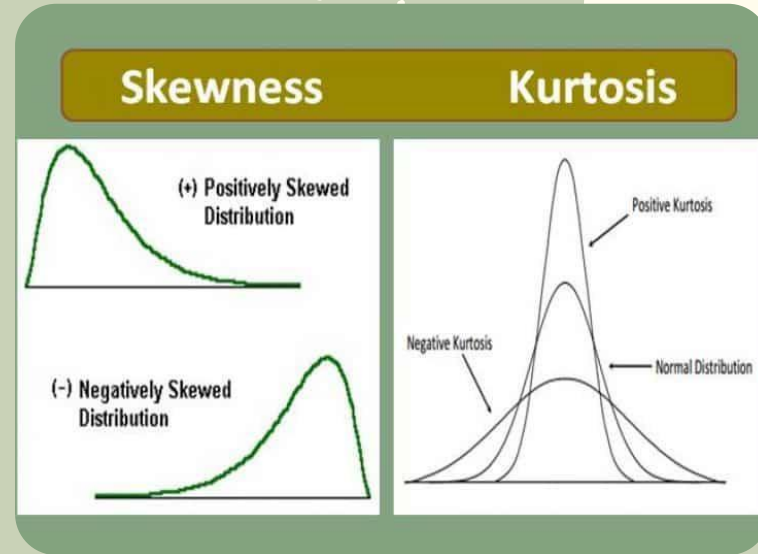
Statistical

Temporal

Frequency

Statistical Features

- Variance
- Standard Deviation
- Interquartile Range
- Skewness
- Kurtosis
- Hjorth mobility
- Hjorth Complexity
- DFA
- Hurst



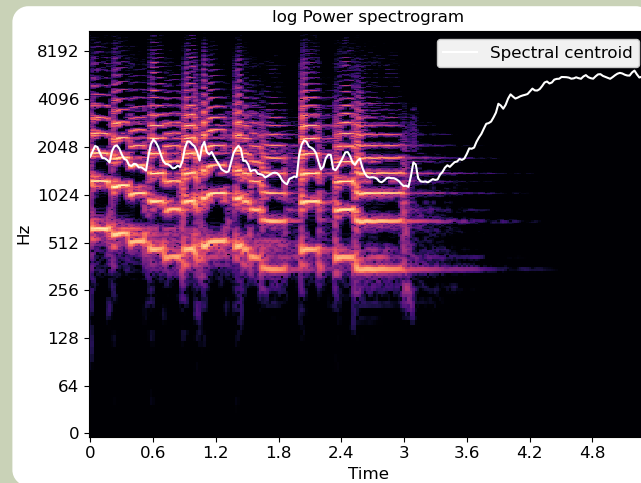
Temporal Features



- Zero-Crossing Rate
- Root Mean Square Energy
- Slope Sign Changes Ratio

Frequency Features

- MFCCs
- delta_MFCCs
- delta2_MFCCs
- Spectral Centroid
- Bandwidth



Frequency Processing

01

Fast Fourier Transformation

02

Spectrogram

03

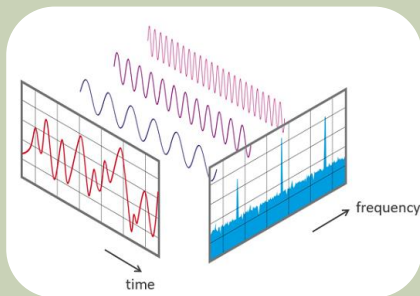
Mel Spectrogram

04

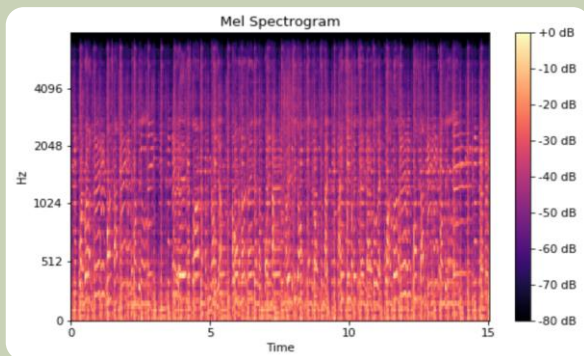
Mel-Frequency Cepstral Coefficients

Processing Steps

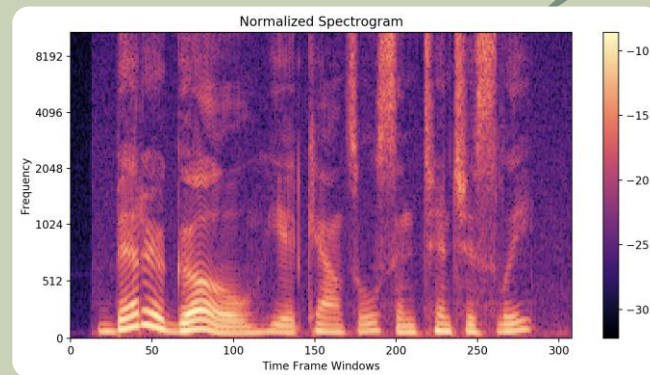
FFT



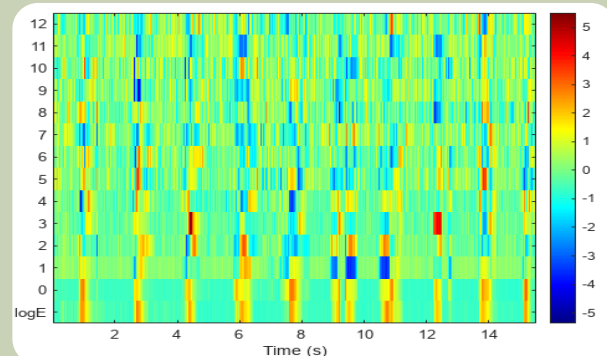
Mel Spectrogram



Spectrogram



MFCC



ML Results

Eurythmy Detection (y/n)

T-test

Model

Random Forest

CV Accuracy: 0.7

Test Accuracy: 0.69

Precision: 0.63

Recall: 0.77

F1-Score: 0.69

	mean_kontrol	mean_eurythmy	p_value
features			
mfcc_1_std	2.058381e+01	2.732229e+01	1.330005e-191
mfcc_2_std	6.970364e-01	9.135830e-01	2.894829e-184
mfcc_4_std	1.573539e-01	1.873600e-01	2.891658e-167
delta mfcc_1_std	2.041327e+01	2.604781e+01	1.499101e-155
mfcc_2_mean	1.845533e+00	1.518966e+00	1.345694e-151
delta mfcc_2_std	7.132347e-01	8.871280e-01	2.218756e-146
mfcc_1_mean	-4.407104e+01	-5.346663e+01	1.102917e-145
mfcc_3_mean	2.308727e-01	1.909942e-01	1.831672e-144
mfcc_8_mean	8.540016e-02	7.053349e-02	6.175182e-140
mfcc_7_mean	8.408431e-02	6.917139e-02	2.856566e-139
mfcc_4_mean	3.265205e-01	2.714686e-01	3.828610e-138
mfcc_6_mean	1.561676e-01	1.298179e-01	1.751355e-136
mfcc_5_mean	1.482412e-01	1.230739e-01	3.118636e-136
mfcc_10_mean	5.659019e-02	4.699163e-02	3.313550e-128

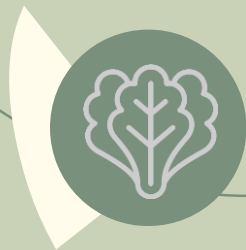
mfcc_3_std	1.345109e-01	1.533055e-01	4.007569e-127
mfcc_9_mean	5.136776e-02	4.252517e-02	1.517383e-125
mfcc_12_mean	4.085781e-02	3.401768e-02	8.305825e-120
mfcc_11_mean	3.839020e-02	3.175306e-02	1.656019e-116
spectral_spread_mean	1.195303e-01	9.912436e-02	6.631478e-108
mfcc_13_mean	2.916533e-02	2.390266e-02	1.257625e-102
mfcc_6_std	1.098918e-01	1.199409e-01	1.293550e-93
delta mfcc_4_std	1.823252e-01	2.031845e-01	3.436077e-91
spectral_spread_std	6.564381e-02	7.294716e-02	1.471261e-83
mfcc_5_std	1.065880e-01	1.152874e-01	4.812216e-81
spectral_centroid_mean	4.955959e-02	4.125566e-02	2.368041e-63
delta spectral_spread_std	5.239278e-02	6.099878e-02	2.169113e-62
slope_sign_changes_ratio	2.477535e-02	8.678106e-03	4.878300e-60
dfa	1.681960e+00	1.633993e+00	2.640268e-52
delta mfcc_3_std	1.647343e-01	1.777800e-01	9.146572e-51
chroma 7_std	5.195644e-02	4.500658e-02	9.849618e-48

Window Size: 0.05s | Hop Length: 0.5ws

ML Results

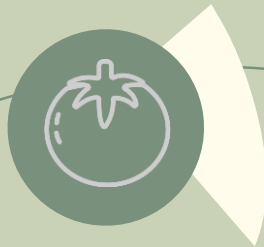
Eurythmy Detection by Plant (y/n)

Salad



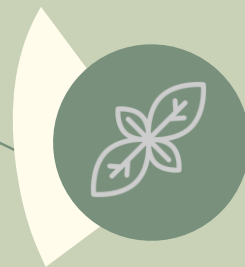
Accuracy 0.67

Tomato



Accuracy 0.72

Basil



Accuracy 0.74



03

**Future
Research**

Human emotion

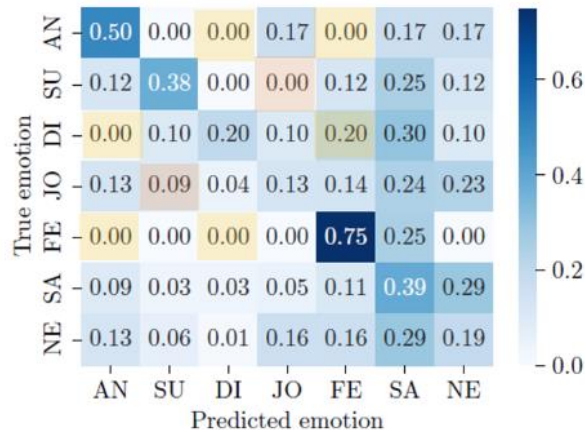
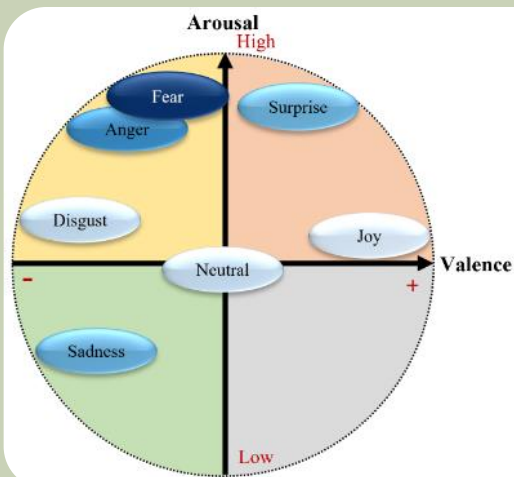
Kruse et al, 2023

Species
Basil

Output
7 emotions

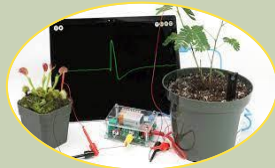
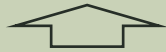
Accuracy
0.32

Model	Test set Accuracy	Test set Recall
MLP	0.399	0.220
biLSTM	0.260	0.351
MFCC-CNN	0.377	0.275
MFCC-RestNet	0.318	0.324



Vision

Bio-Lingo



Elings, 2016

Effects of plants on People

physical

1. Stress and mental fatigue relief
2. Treatment of mental health issues
3. Lower blood pressure and heart rate
4. Faster recovery from stress
5. Reduction in risk factors for diseases

mental

6. Improved self-esteem and responsibility
7. Enhanced tranquility and enjoyment
8. Promotion of relaxation and reflection
9. Positive correlation with well-being

social

10. Stimulation of social cohesion
11. Enhanced social interaction
12. Reduction in loneliness

Thanks!



Do you have any questions?

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