



CENTER FOR EMBEDDED NETWORKED SENSING

# IMAGEin Ecology

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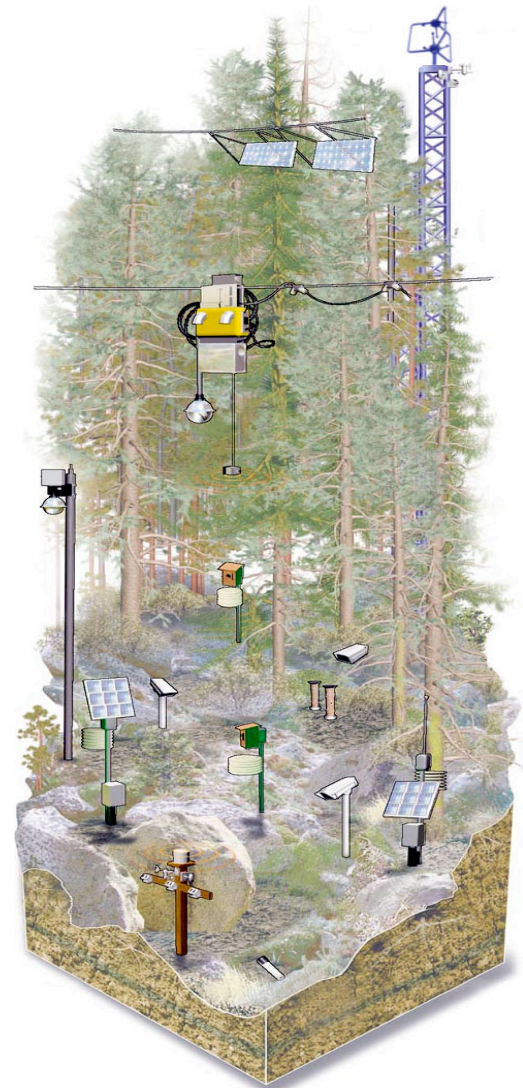
# Inferring ecological states through images

- There are questions we can't (easily) answer with traditional sensors

- What are the CO<sub>2</sub> relations of a plant in the field?
- Is the flowering and leafing events of different species synchronized with pollinators and herbivores?
- When do the different stages of the avian breeding cycle occur and what types of behaviors do birds exhibit in these stages?

- Indirect sampling of actual phenomena of interest

- Color  $\diamond$  CO<sub>2</sub>
- Timing of flowering  $\diamond$  synchrony of pollinators
- Egg Count  $\diamond$  breeding stage





# Overcoming limitations of general vision approaches

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## Category Recognition Goal:

Distinguish between many categories, including an “everything else”.

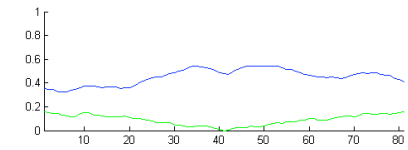
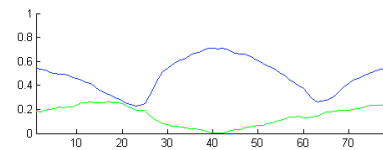
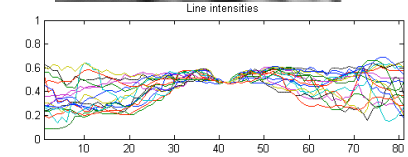
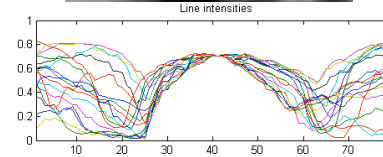
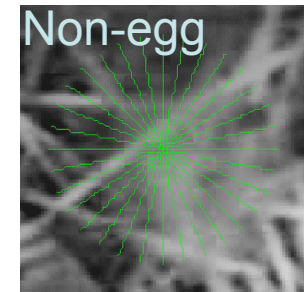
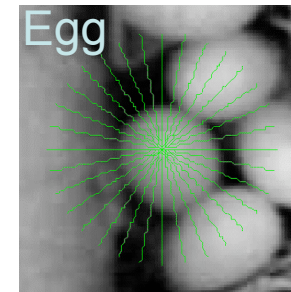
## Application Goal:

Distinguish between a few categories, knowing the data collected will only contain those categories on a constrained system.

	SIFT Descriptor		Profile Intensity	
	Precisio	Recall	Precisio	Recall
1000+ images	80.61%	53.50%	96.72%	84.14%

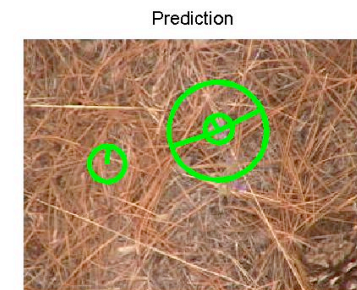
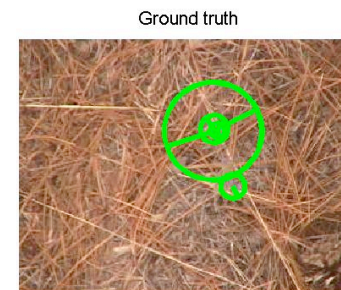
## Our Approach

- Find an relationship from the problem space into feature/model pairs
- Allow the application to determine the parameters
- Systemically integrate domain knowledge



## Generalizable? :

### Detecting flowers in meadows



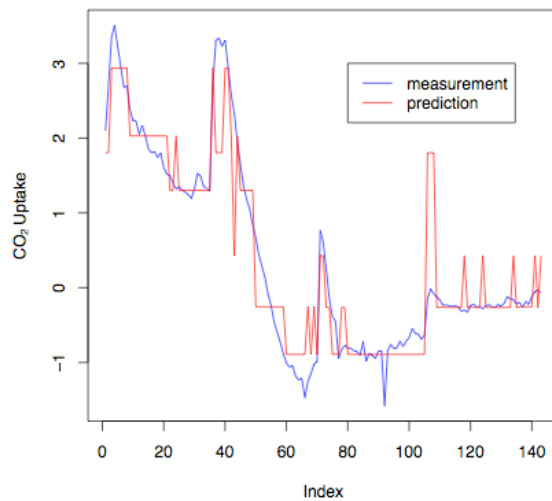
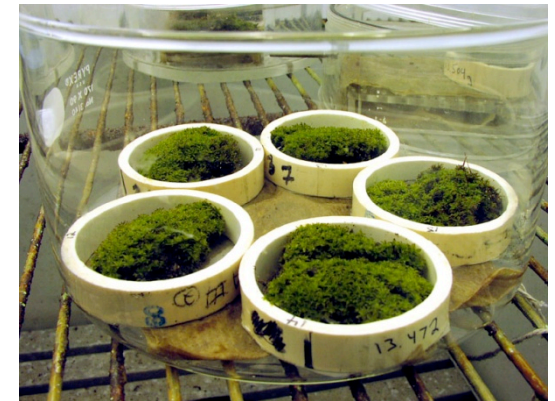
# Doing what humans can't do

## Application Goal:

Determine CO<sub>2</sub> uptake of a drought-tolerant moss in the field.

## Using Domain Knowledge:

There is a known correlation between moss color and CO<sub>2</sub> uptake. However, requires a human observer in the field at all times.



## Building a model:

1. Extract color based image features
2. Build a regression based model of CO<sub>2</sub> data collected in a laboratory.



Eventually, apply to historical data from existing experiments in the field.



# Imagers and interactive sensing

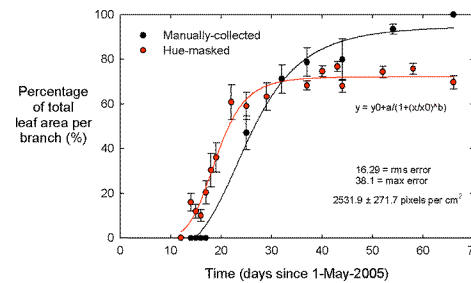
Area of interest



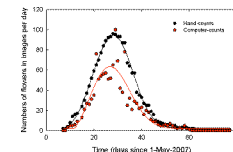
Interactive visualization & image processing



Image Capture



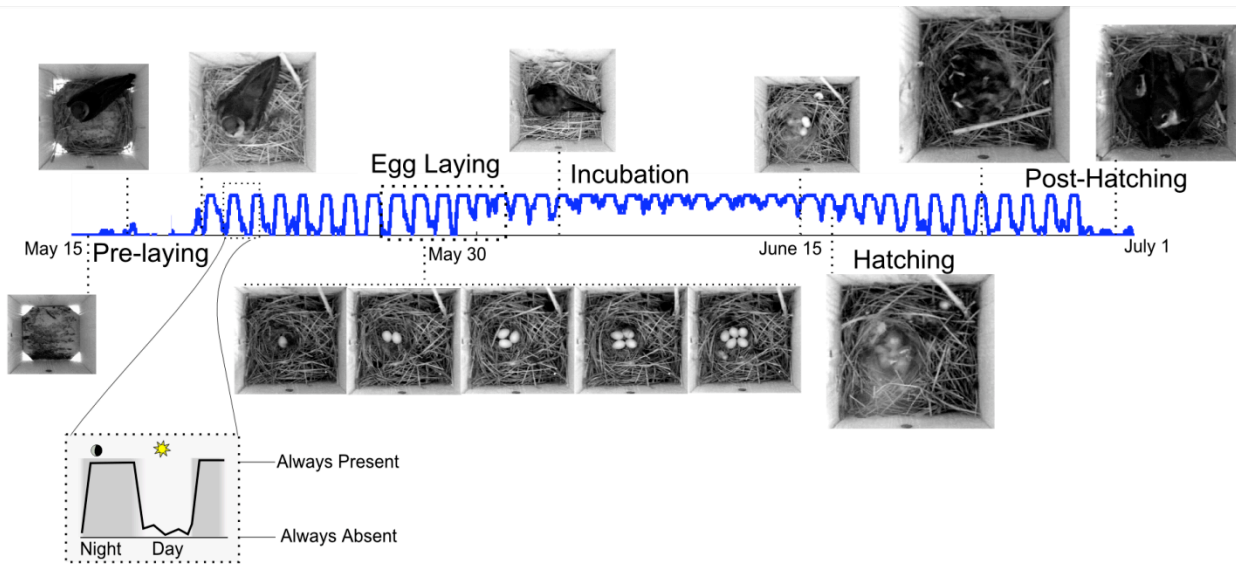
Scientific results





# Developing the system

*End Goal: Snapshot of nesting cycles.*



## Characteristics

- Dense Spatial Sampling
- Remote Locations
- Automated Processing

## Approach

- Low-power image sensor and radio
- Adaptive Sampling
- Partition computation across a hierarchy of heterogeneous processors

