## Mitigating Heat Stress in Dairy Cattle using a Physiological **Sensing-Behavior Analysis-Microclimate Control Loop**

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> Cows stand longer to cool down when ambient temperatures rise, which also

increases the risk of lameness [1, 2]

### Sensors for data collection

- Neck sensor: 3D location and head direction
- Ankle sensor: resting duration
- Vaginal sensor: body temperature
- Log of milk yield

Cow

standing,

feeding,

licking,

milking

Cow

drinking

Cow

resting

Individual

health

status

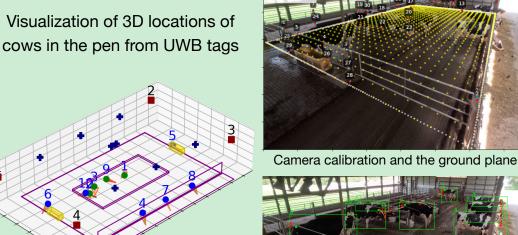
- Isometric-view cameras: visual references
- Environmental sensor: indoor temperature-humidity index (THI)
- Outdoor weather station

14 days at UW-Madison's Arlington Agricultural Research Station



UWB nodule

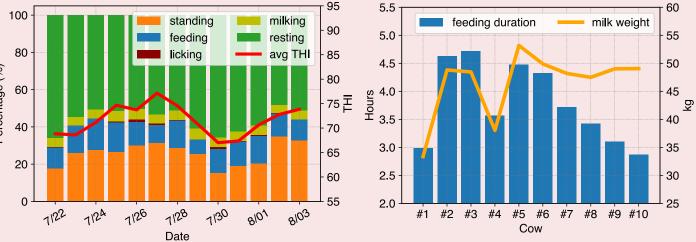
Custom neck-mount UWB tag for collecting cow's 3D location and head direction





Projected 3D locations and neck points

Average time spent on feeding and average milk production of the cows



### INTRODUCTION

Heat stress in dairy cattle threatens animal well-being and the sustainability of dairy farming

Cattle behavior changes provide important indications of heat stress

There is a lack of open datasets for cattle physiological and behavior monitoring in real-world environment

### DATASET

This dataset provides synchronized data of ten Holstein cows including:

- Neck 3D location, acceleration, magnetic field, and air pressure
- Ankle acceleration and vaginal temperature
- Daily milk yield of each cow
- Isometric-view images of the cows from four pen corners
- Indoor temperature and humidity
- Outdoor weather

### **EVALUATION**

Evaluation of cattle's behaviors as baseline for further research:

 Standing duration increases corresponding to indoor THI:

Lameness

UWB

distances to

anchors

Neck

magnetic and

acceleration

Cow's ankle

acceleration

Isometric-

view images

2

Indoor conditions

Outdoor weather

Standing duration

Data utilization for dairy cattle health monitoring

3D neck

location

3D head

direction

Clusters of

acceleration

Bounding

box

Classifier

Classifier

Classifier

Visual

references

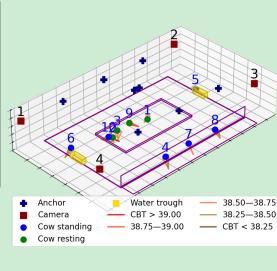
Individual

behavior

analysis

Deployed on 10 Holstein cows for

# Visualization of 3D locations of



### Occupancy heatmap of cows from 3D locations

UWB

localization

Tilt-

compass

K-Means

clusterring

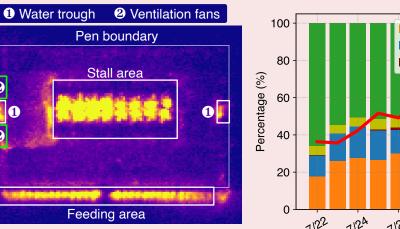
Automated

annotation

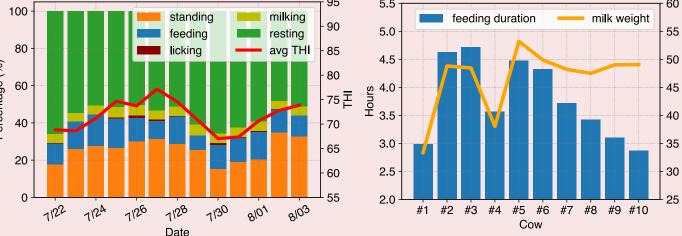
Daily milk weight

Vaginal temperature

ompensated



Behaviors of cow #9 vs indoor THI during 14 days of the experiment



- R = 0.79 (cow #9)
- Classifying standing/resting from UWB location: accuracy 97%
- High-milk producing cows often spend more time feeding

### **IMPACTS**

We present the first large-scale multimodal dataset that allows comprehensive monitoring of dairy cattle and better understanding of how their behaviors change under the effects of ambient conditions

### Impacts on Society:

- Address public concerns on environmental sustainability and animal welfare
- Improve economic sustainability of dairy industry

[1] Allen, J. D., et al., Journal of Dairy Science, 2015. [2] Cook, Nigel B., et al., The Veterinary Journal, 2009.

### Impacts on Education and **Outreach:**

- Offer opportunities to learn embedded computing, animal welfare, and machine learning
- · Promote participation of underrepresented students in engineering majors

### **Potential Impacts**

- · Eliminate labor and financial costs in collecting real-world data of dairy cows
- Provide baseline for advanced monitoring systems in dairy barns

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