



Individual Bee Identification using Computer Vision

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Who am I?

- Applied Data Science, College of IST 2023
- Bucks County, PA
- Free Time: Music (Jazz and Classical)
- Got involved through ENT 222N



Overview



01

**Method:
Tracking Bees
with Computer
Vision**

02



**Current
Performance/
Findings**

03



Future Work



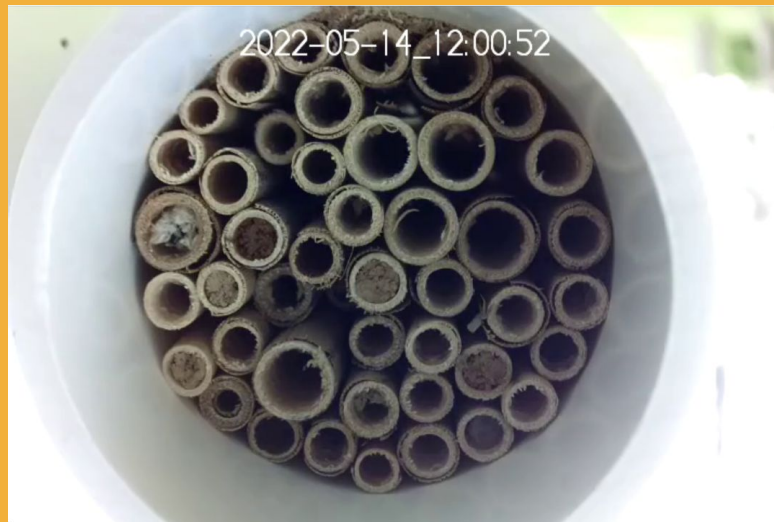
01 Tracking Bees with Computer Vision



THE PROBLEM

**Tracking bees from videos
is tedious and
time-consuming**

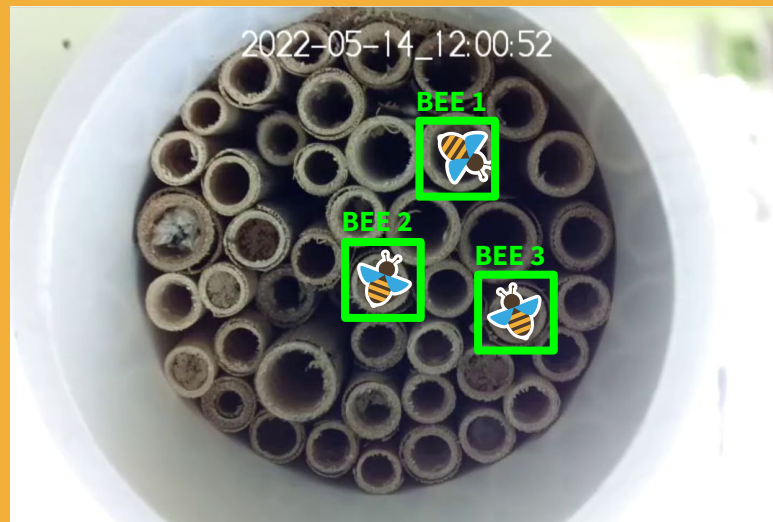
Motivation: Discover effects
on foraging behavior, health
of bee, etc.





THE SOLUTION

Identify + Track Bees with
Computer Vision

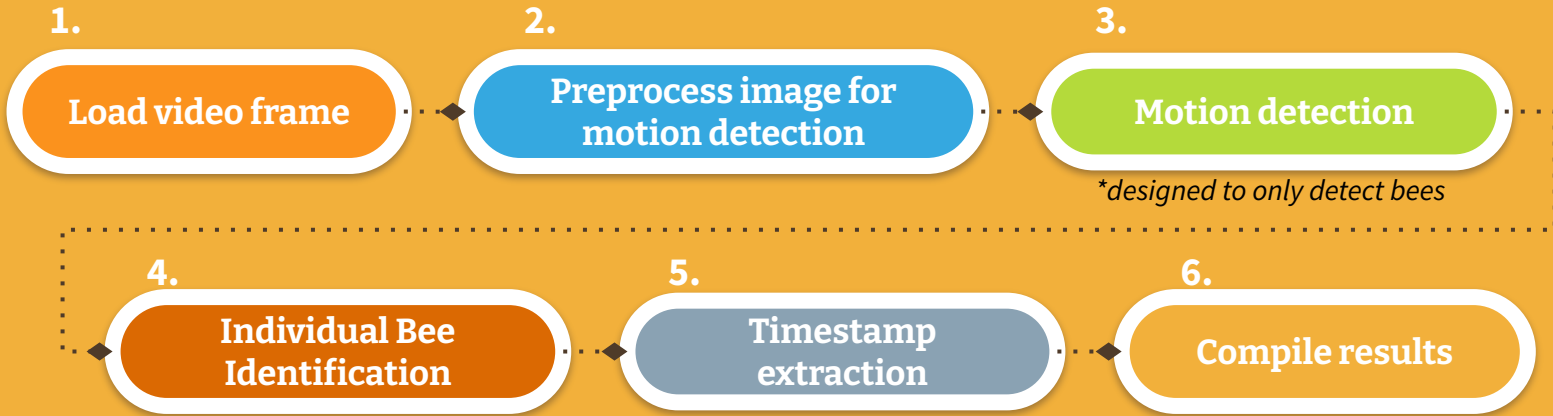




How does **computer vision** help?

- Process each frame of the video to:
 - Identify circles (tubes) in the video
 - Detect motion
 - Associate motion with bees
 - Assign bees to tubes = individual bee identification

Individual Bee Identification Steps

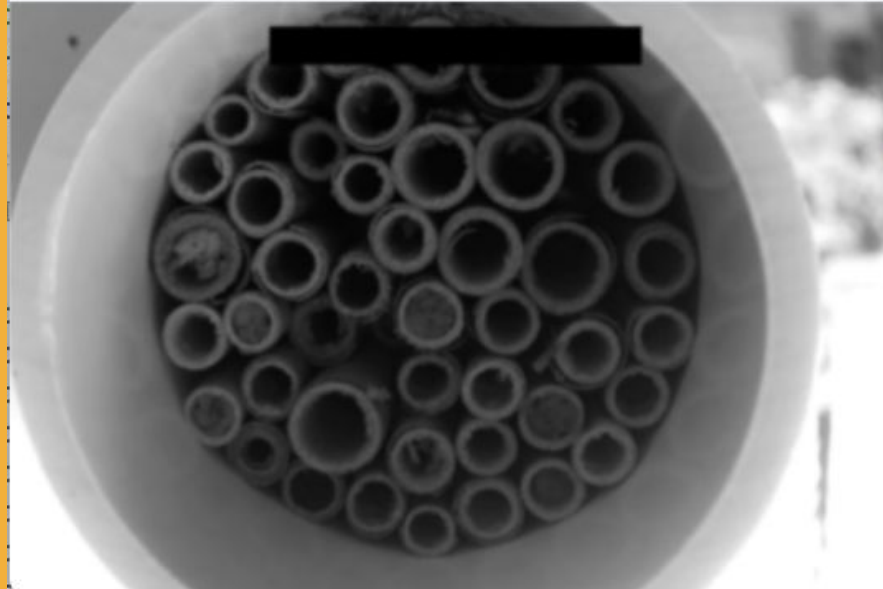


Load video frame

Date	Start Time	End Time
5/14/22	10am	10:59 am
5/14/22	11am	11:59 am
5/14/22	12pm	12:59 pm

Videos Processed

Preprocess image for
motion detection



Preprocessing Steps

1. BGR \rightarrow RGB
2. Convert to grayscale
3. (Slightly) blur image

Motion detection



Contours, small and large



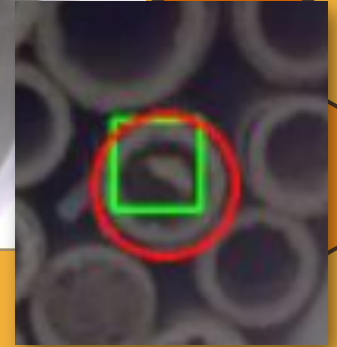
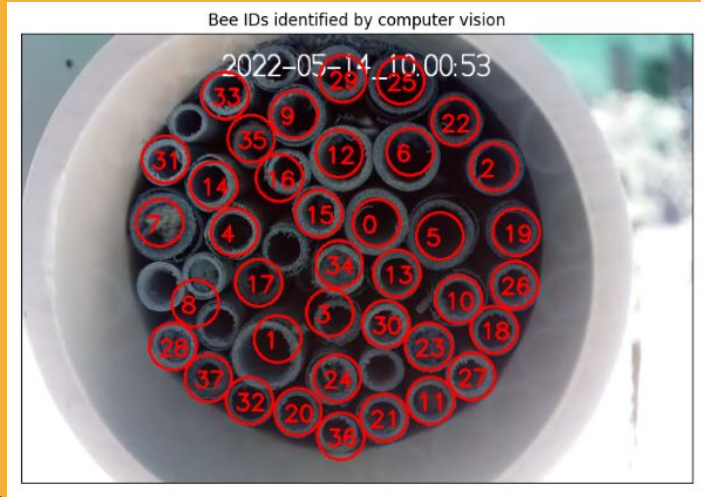
Large contour identified with a bee (green)

Motion Detection Steps

1. $\text{abs}(\text{difference between frames})$
2. Keep pixels that changed “enough”
3. Calculate groups of pixels (aka “contours”)
4. Remove any contours with area <400 or >1000 pixels

These contours are our potential bees.

Individual Bee Identification

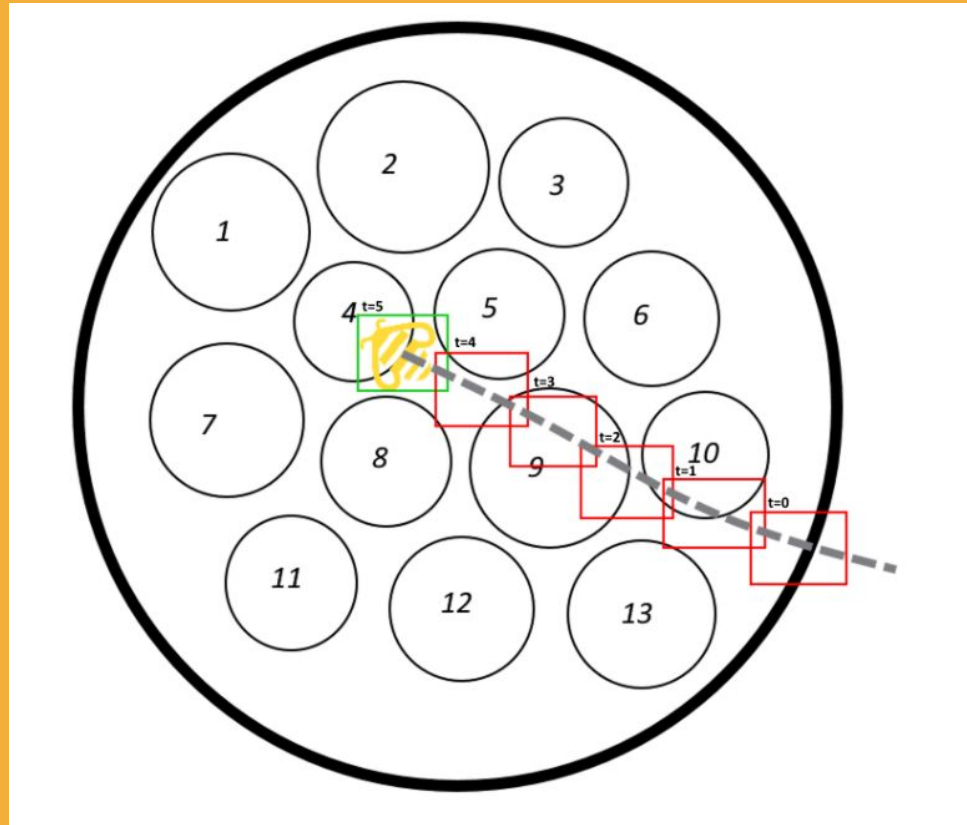


Individual Bee Identification Steps

Based on the assumption that each tube belongs to one bee

1. Assign each tube a number
2. Calculate distance from each tube to contour
3. Assign contour to the number associated with the closest tube

Individual Bee Identification

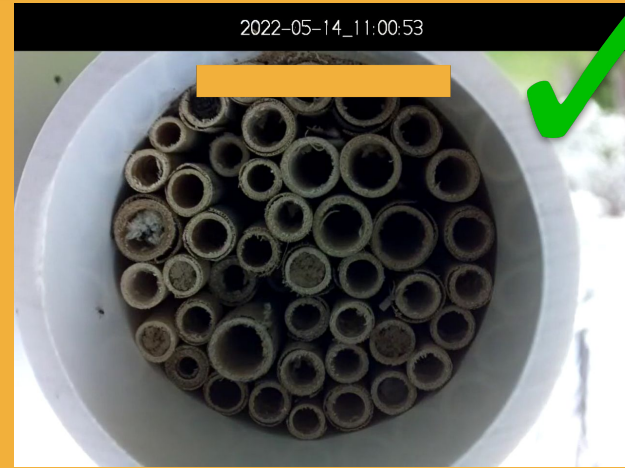


Contour window technique

Timestamp extraction



Current Timestamp placement



Ideal Timestamp placement

Timestamp Extraction Steps

1. Crop to timestamp bounding box (determined by human)
2. RGB → grayscale
3. Invert image (so text is black)
4. Add 10 pixels padding around timestamp
5. Apply Optical Character Recognition (OCR) to get timestamp
6. Clean extracted timestamp as necessary

Compile results

Tube Centers
with Bee IDs

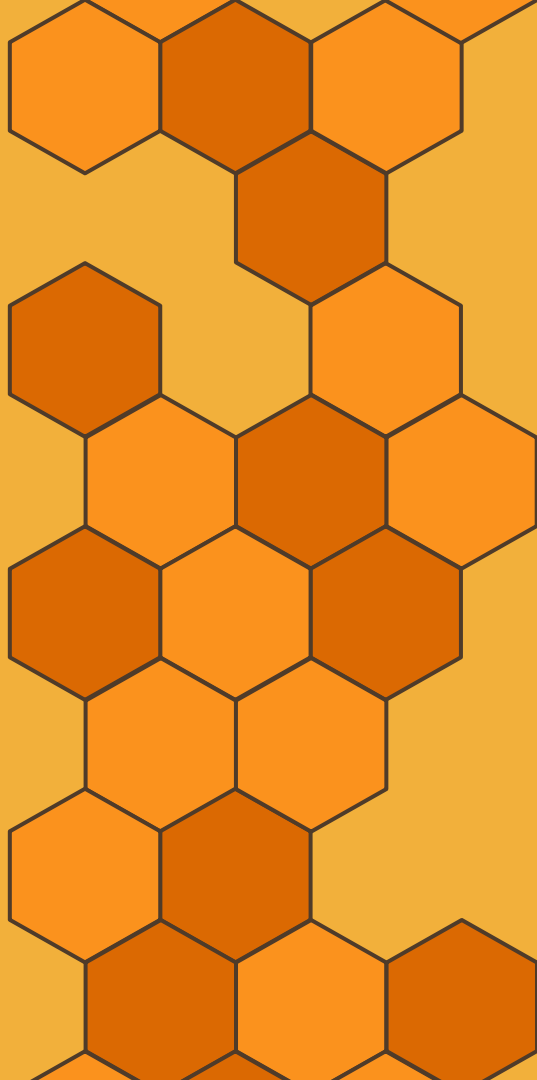
```
31 Bee ID=28 Tube Hive Coords: [162 334]
32 Bee ID=29 Tube Hive Coords: [344 48]
33 Bee ID=30 Tube Hive Coords: [390 310]
34 Bee ID=31 Tube Hive Coords: [154 134]
35 Bee ID=32 Tube Hive Coords: [244 392]
36 Bee ID=33 Tube Hive Coords: [218 66]
37 Bee ID=34 Tube Hive Coords: [340 246]
38 Bee ID=35 Tube Hive Coords: [246 112]
39 Bee ID=36 Tube Hive Coords: [342 430]
40 Bee ID=37 Tube Hive Coords: [200 368]
```

Detected
events

```
41
42
43 Bee ID=22 detected at frame 38/108042.0, Timestamp: 10:00:00
44 Bee ID=25 detected at frame 38/108042.0, Timestamp: 10:00:00
45 Bee ID=22 detected at frame 38/108042.0, Timestamp: 10:00:00
46 Bee ID=25 detected at frame 38/108042.0, Timestamp: 10:00:00
47 Bee ID=25 detected at frame 40/108042.0, Timestamp: 10:00:54
48 Bee ID=31 detected at frame 40/108042.0, Timestamp: 10:00:54
49 Bee ID=25 detected at frame 40/108042.0, Timestamp: 10:00:54
50 Bee ID=31 detected at frame 40/108042.0, Timestamp: 10:00:54
51 Bee ID=32 detected at frame 42/108042.0, Timestamp: 10:00:52
52 Bee ID=37 detected at frame 42/108042.0, Timestamp: 10:00:52
53 Bee ID=28 detected at frame 42/108042.0, Timestamp: 10:00:52
54 Bee ID=14 detected at frame 42/108042.0, Timestamp: 10:00:52
55 Bee ID=2 detected at frame 42/108042.0, Timestamp: 10:00:52
56 Bee ID=32 detected at frame 42/108042.0, Timestamp: 10:00:52
57 Bee ID=37 detected at frame 42/108042.0, Timestamp: 10:00:52
58 Bee ID=28 detected at frame 42/108042.0, Timestamp: 10:00:52
59 Bee ID=14 detected at frame 42/108042.0, Timestamp: 10:00:52
```



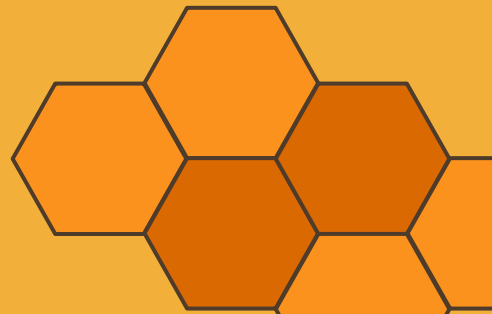

Demo!





02

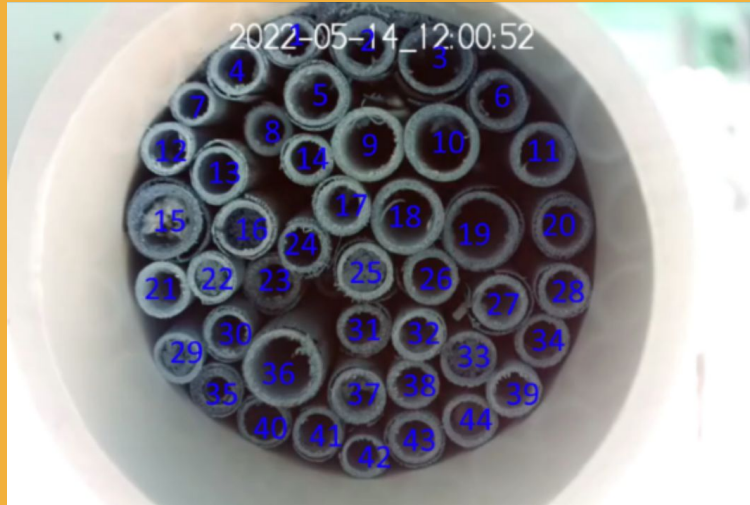
Current Performance/ Findings



TP, FP, Precision Rates

https://personal.psu.edu/gvg5207/bee_demo.html

Bee Identification Precision



Bee ID	Precision (%)
20	86
39	83
8	62
35	62
6	44

We can go to a log entry and know that it will be **THE CORRECT BEE**
We can go to a log entry and know that it will be **A BEE**

19.3% of the time.
71.0% of the time.



03

Future Work



Future Works



- Compare Kalman Filter to contour window*
- Fine-tune motion detection parameters to reduce FPs
- New hotel setup to simplify the problem

*already started



THANKS!

Do you have any questions?

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