

# EBVC: Electronic Bee-Veterinarian – Beyond Monitoring and Onto Control



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# Outline

- ➔ ● Introduction & Background
- Dataset & Experimental Setup
- Proposed Framework: EBVC
- Experiments
- Conclusion

# Honeybees are Vital Pollinators

- > 80 crops
- ~ \$550 billion globally
- ~ \$29 billion for the US
- if bees die, agriculture will suffer.
- 2025: ~ 62% of US bees lost

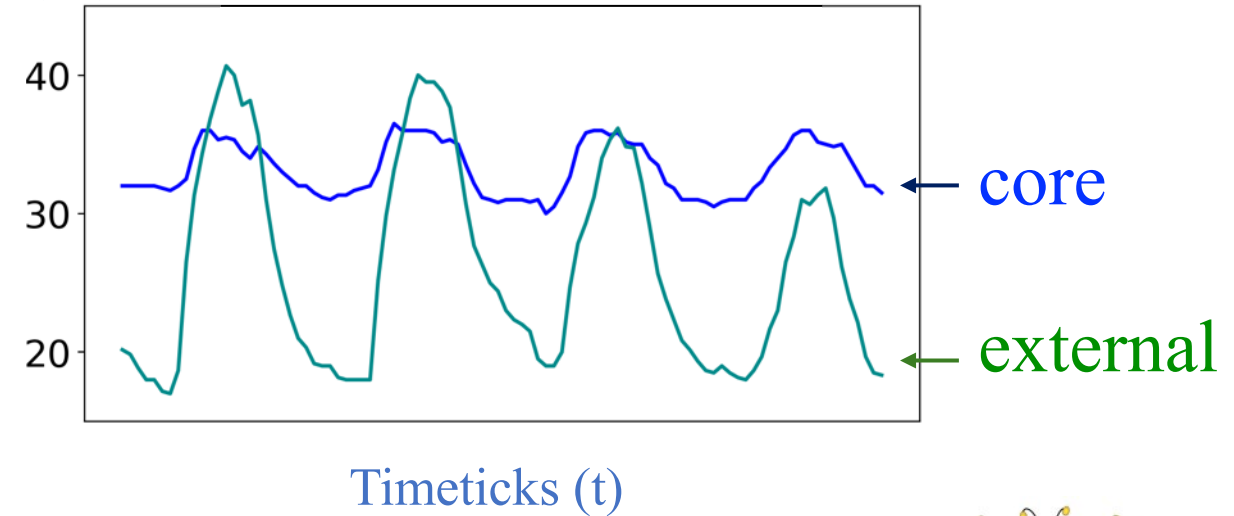


# Background (1/2) - thermoregulation



Core Area  
(Near brood nest area)

Temperature ( $^{\circ}\text{C}$ )



$$33^{\circ}\text{C} \leq \text{Core Temp}, \Theta(t) \leq 36^{\circ}\text{C} =$$



Temperature deviation  $\rightarrow$  bee thermoregulation  
 $\rightarrow$  lost honey production.

# Background (2/2) - treatment



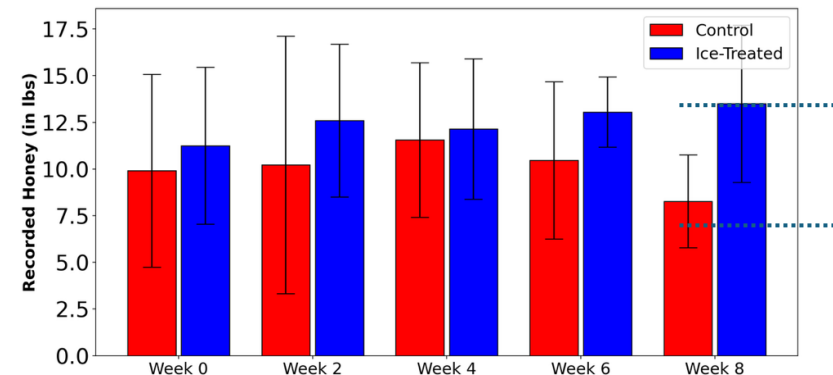
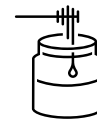
**Control Hive**  
(5 in total)



**Treated Hive**  
(5 in total)



Currently: Beekeepers add ice-packs

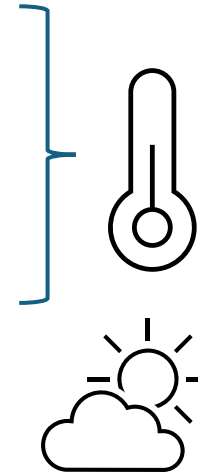
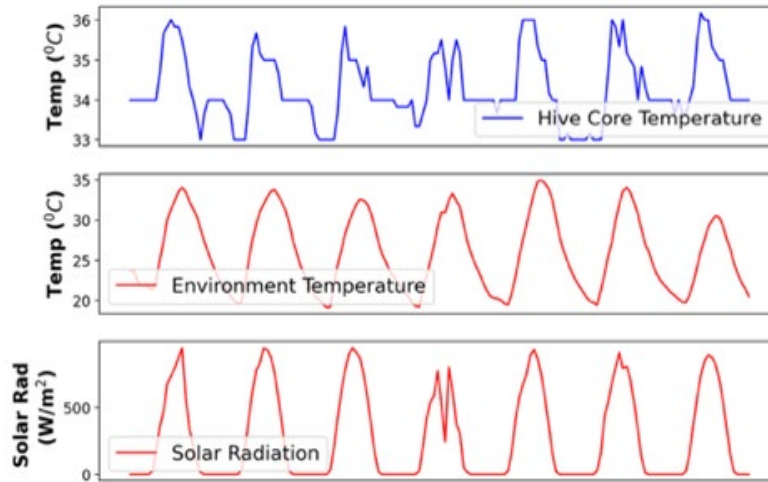


More  
honey,  
if ice-  
treated

Our goal: How to automate ‘ice-packs’/treatment?

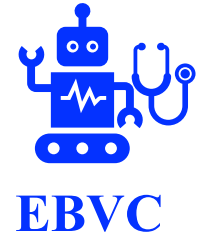
# Problem Statement: automate treatment

**GIVEN:**



**Sensor Data**

**Weather Station Data**



**FIND:**

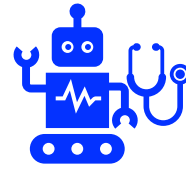


***G1: Controller Schedule***



***G2: Estimate Revenue***

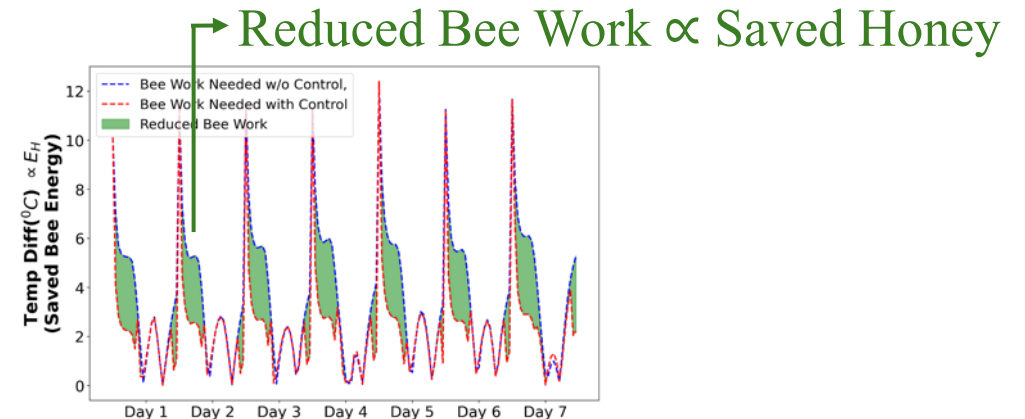
# Contributions : EBVC



✓ C1:  $EBVC_{model}$  Thermal Model

$$\nabla^2 \theta \propto \frac{\partial \theta}{\partial t} = \sum_j k_j (\theta - \theta_j) + \dots$$

✓ C2:  $EBVC_{honey}$  Honey Production



✓ C3:  $EBVC_{opt}$  Temperature Control



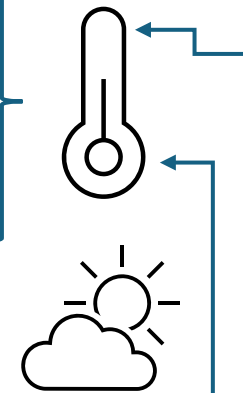
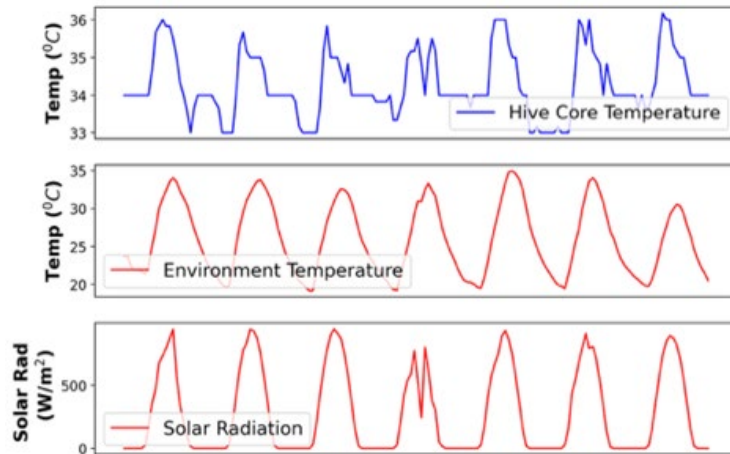
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# Dataset & Experimental Setup

**Hive Data:**

**Environment Data:**



Core Area  
(Near brood nest area)

Sensors

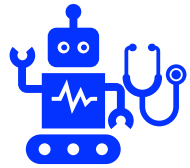
Peripheral Area  
(external temperature)

California Irrigation Management Information  
System (CIMIS)

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# Overview (1/2): EBVC Hardware

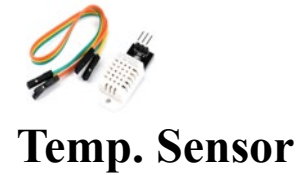


EBVC

Empty  
Hive



Amortized cost:  
~ \$62/year



Sensing &  
computing

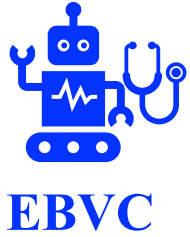


Actuator

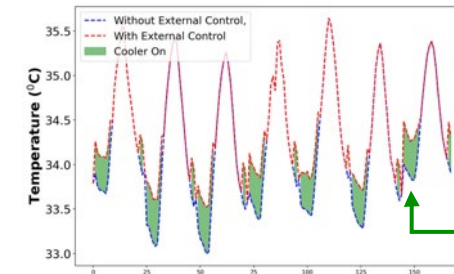
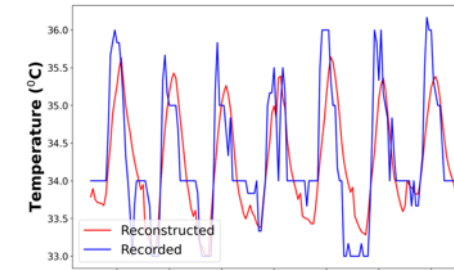
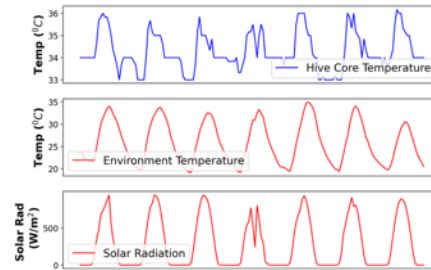


Power

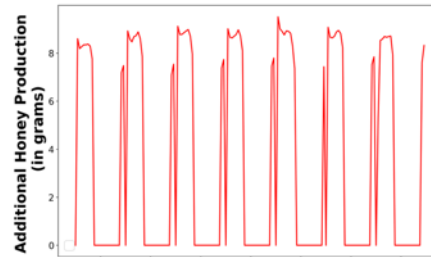
# Overview (2/2): EBVC Software



## 1) $EBVC_{model}$ : Estimation



Saved effort



## 3) $EBVC_{honey}$ : Honey Production *G2*: Estimate Additional Revenue

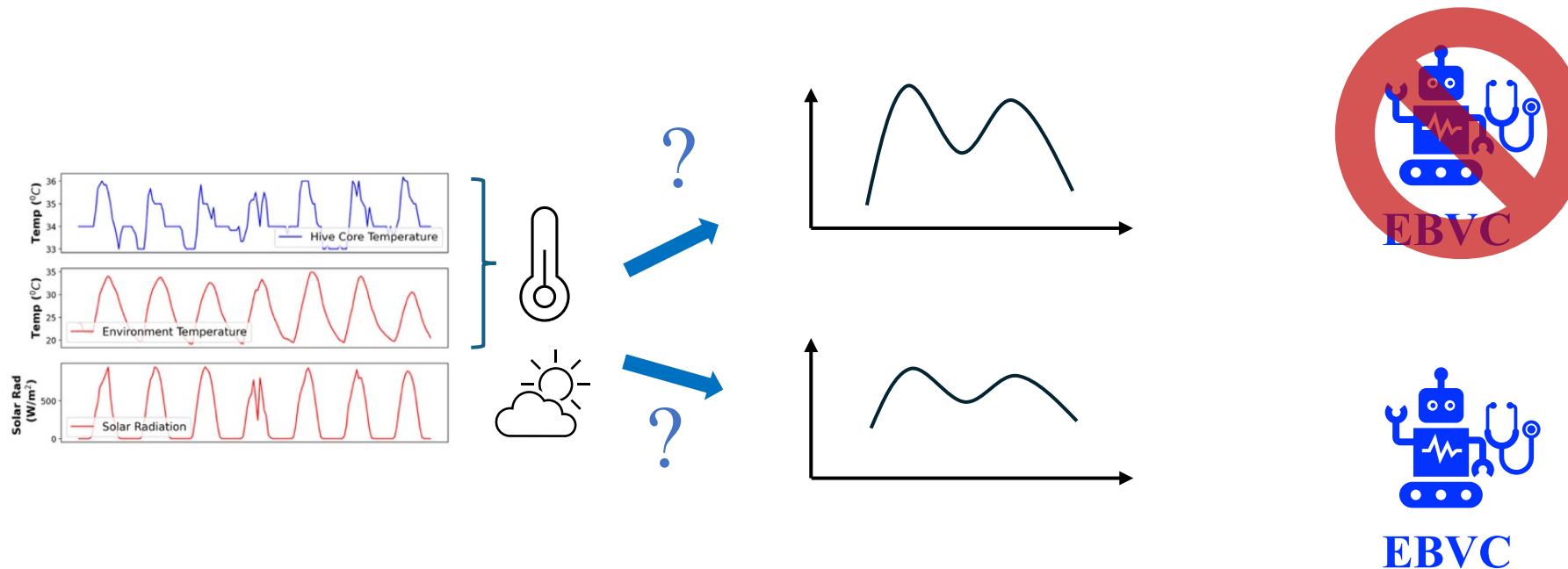
## 2) $EBVC_{opt}$ : Optimal Control *G1*: Controller Operation Schedule

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# EBVC<sub>model</sub> for Thermal Modeling

Q: What will the temperature be, with/without EBVC?



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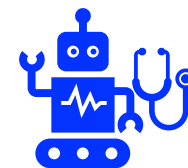
A:

$$\frac{\partial \theta(t)}{\partial t} = 6[(k_w + k' + k_a)(\theta_e(t) - \theta(t)) + \alpha_w S(t)] - h \frac{r_c r_h (1 - e^{-\theta(t)})}{r_h + r_c e^{-\theta(t)}} - P(t)$$

# EBVC<sub>model</sub> for Thermal Modeling

Q: What will the temperature be, with/without EBVC?

A:



$$\frac{\partial \theta(t)}{\partial t} = 6[(k_w + k' + k_a)(\theta_e(t) - \theta(t)) + \alpha_w S(t)] - h \frac{r_c r_h (1 - e^{-\theta(t)})}{r_h + r_c e^{-\theta(t)}} - P(t)$$

Newton's law of cooling

Thermal diffusion

Solar radiation

Honeybee thermoregulation

EBVC

# EBVC<sub>model</sub> for Improved Thermal Modelling

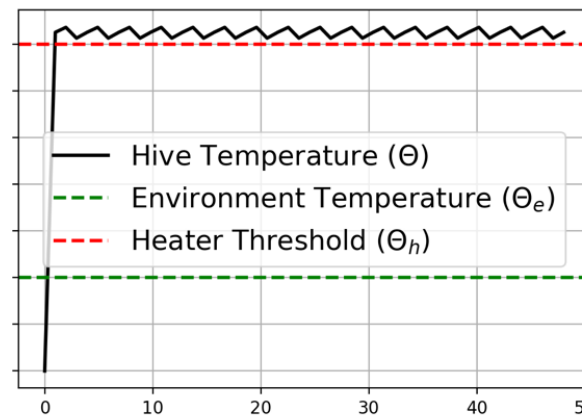
$$\frac{\partial \theta(t)}{\partial t} = 6[(k_w + k' + k_a)(\theta_e(t) - \theta(t)) + \alpha_w S(t)] - h \frac{r_c r_h (1 - e^{-\theta(t)})}{r_h + r_c e^{-\theta(t)}} - \underbrace{P(t)}$$

EBVC



temperature

33°C



Hive temperature

Heating threshold

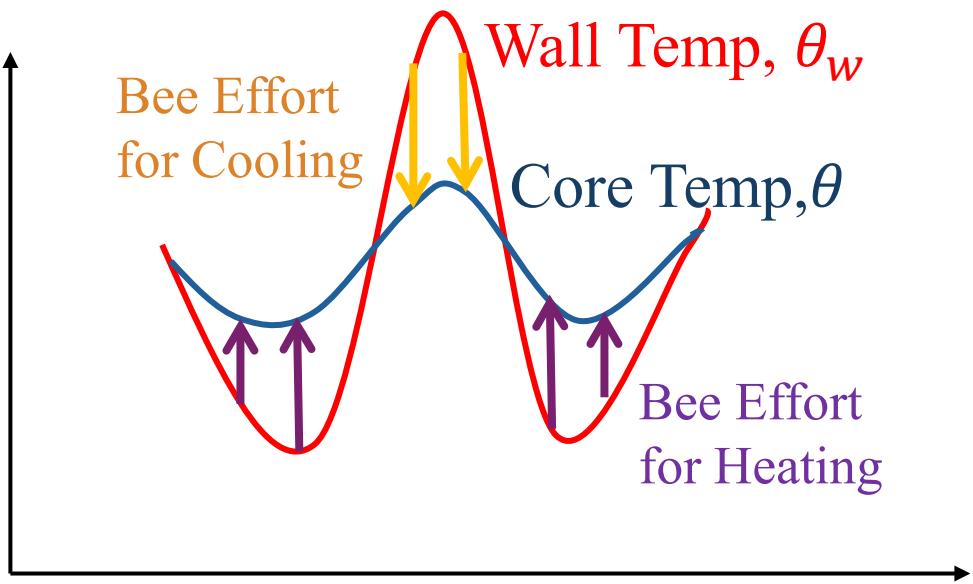
External temperature

## Control Theory: P-Controller

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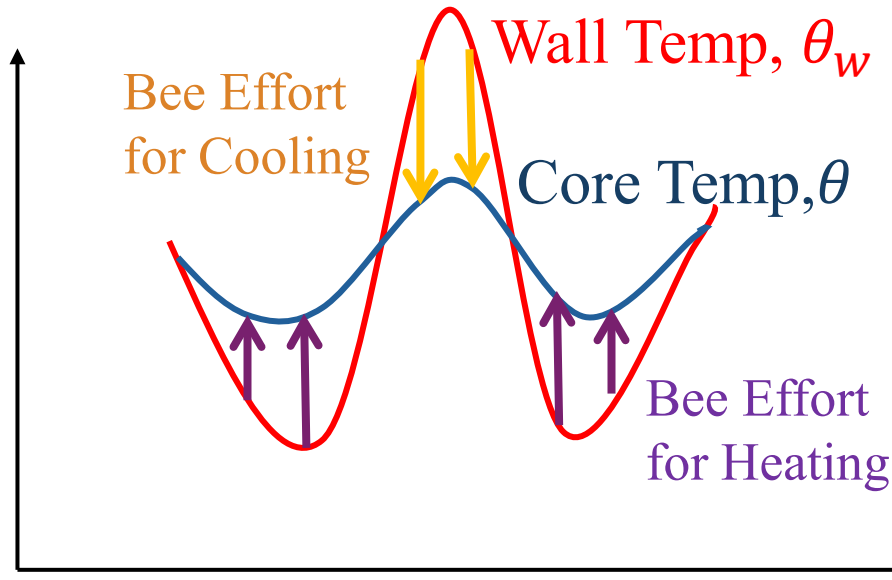
# EBVC<sub>honey</sub> for Honey Production Modelling



1°C cooling  $\propto$  12g honey

1°C heating  $\propto$  3g honey

# EBVC<sub>honey</sub> for Honey Production Modelling



1°C cooling  $\propto$  12g honey

1°C heating  $\propto$  3g honey

For Heating, 
$$H_H(t) = 3|(\theta_w - \theta) - \left(\frac{1}{6} \left( \sum_{n=1}^5 \theta_w + \theta_{w_{b,adj}} \right) - \theta_{adj}\right)|$$

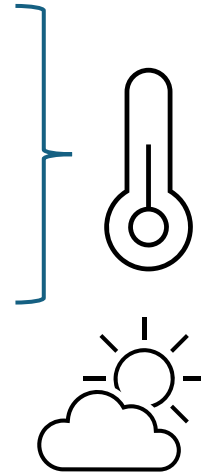
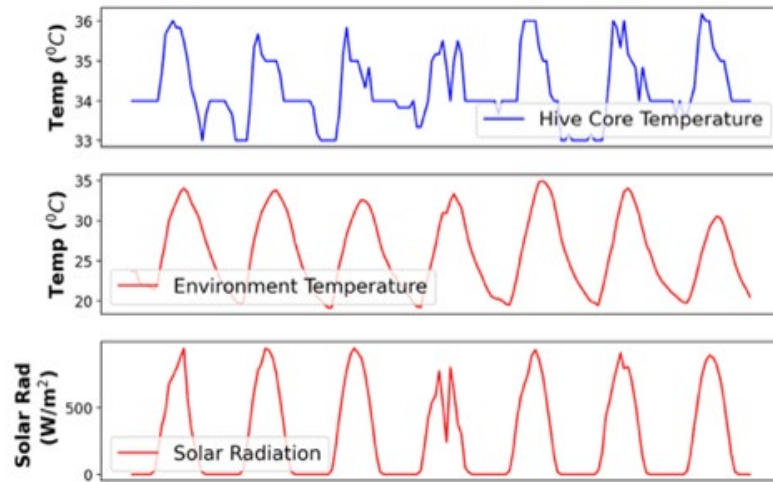
For Cooling, 
$$H_C(t) = 12|(\theta_w - \theta) - \left(\frac{1}{6} \left( \sum_{n=1}^5 \theta_w + \theta_{w_{t,adj}} \right) - \theta_{adj}\right)|$$

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# EBVC<sub>opt</sub> for Control Optimization



Activate  
Heating



Activate  
Cooling



(Fixed thresholds: we can do better than that.)

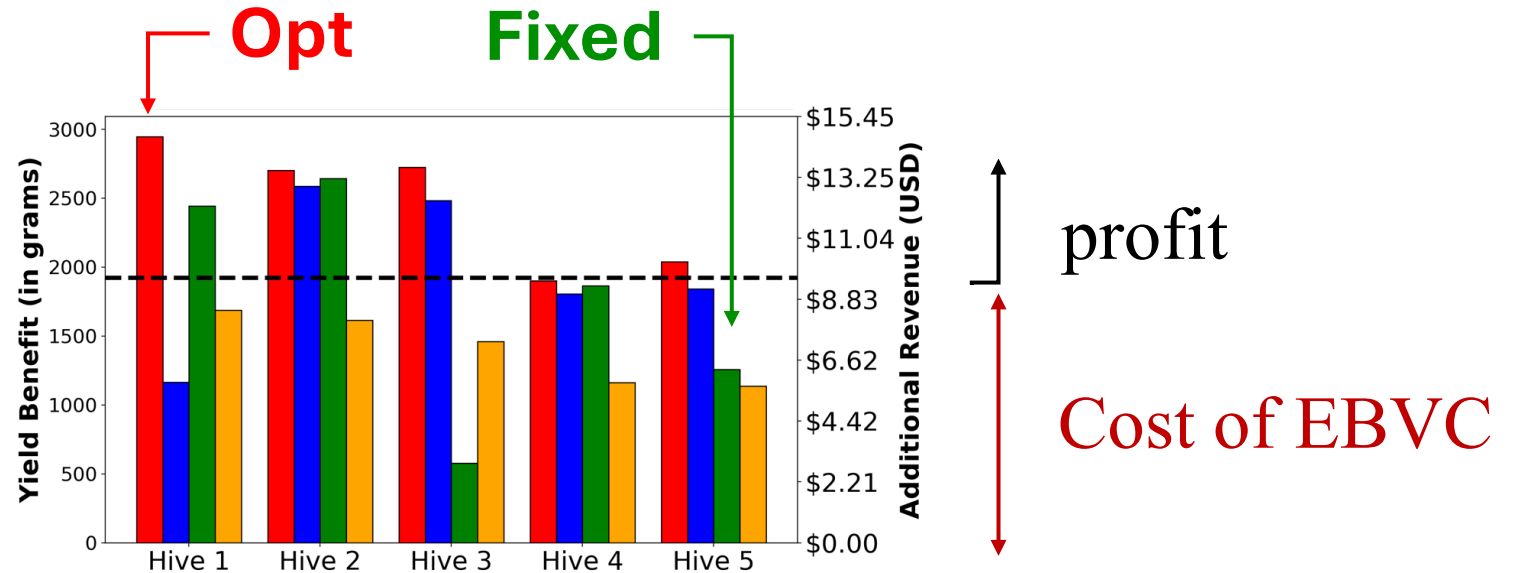
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# Q: Yield?

## Baselines:

1. FCFS: First-Come First-Serve
2. Fixed threshold  $\theta_{LT} = 33^{\circ}C$ ,  
 $\theta_{HT} = 36^{\circ}C$
3. Fixed operation time



Estimated gain: ~ \$71 / year

+ Even more: pollination benefits

# CONCLUSIONS

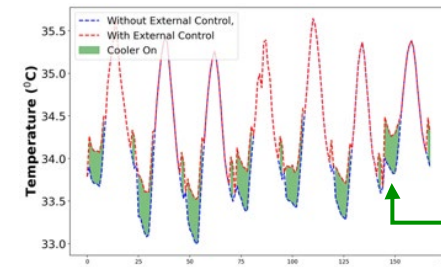


- ✓ C1:  $EBVC_{model}$  Thermal Model
- ✓ C2:  $EBVC_{honey}$  Honey Production
- ✓ C3:  $EBVC_{opt}$  Temperature Control

 [github.com/rtenlab/EBVC](https://github.com/rtenlab/EBVC)

Sponsor: 

$$\nabla^2 \theta \propto \frac{\partial \theta}{\partial t} = \sum_j k_j (\theta - \theta_j) + \dots$$



Saved effort

