

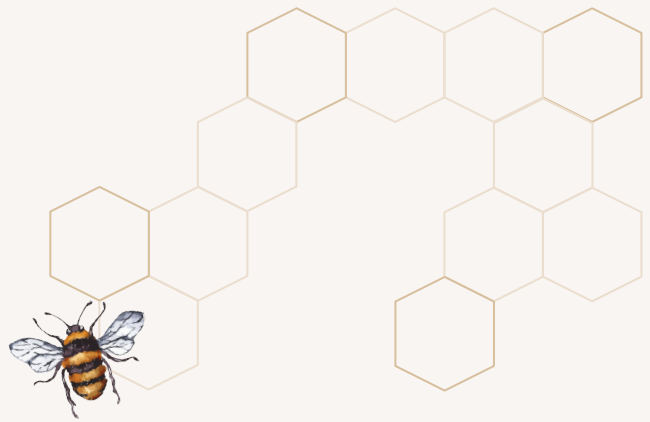


Agent-based model of foraging bee behaviour

UvA CLS ABM 2024 - **Group 5**

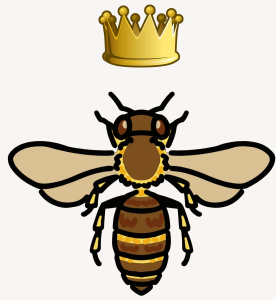
P. Alves, J. Schäfer, B. Golik, K. Ullah & D. Leunk





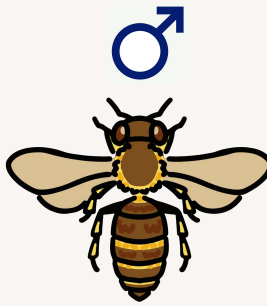
1. Introduction





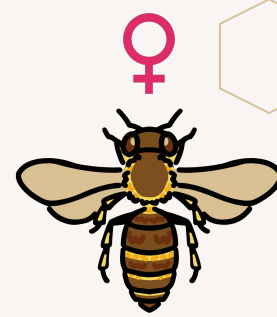
Queen

- 1 queen bee
- Lay eggs, mostly



Drone

- 10%–15% of population
- Pass their genes (and that's it)



Worker

- 80%–90% of population
- Can't mate, but do **everything** else
- Care about brood
- Guard the nest
- **Forage for resources**

Eusociality: division of labour into reproductive and non-reproductive groups

Polyethism: functional specialization of non-reproductive individuals





Goal & motivation

Polyethism

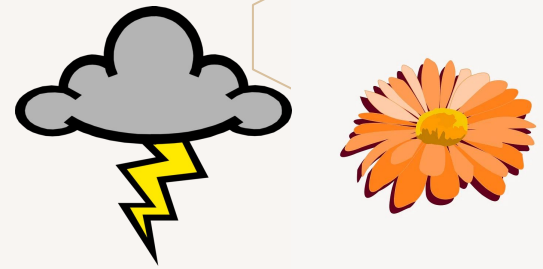
- correlated with age (young bees stay in nest, old bees forage)
- adaptive based on colonies needs
- in this work: changing **weather conditions** and varying **resource sparsity**

Interactions:

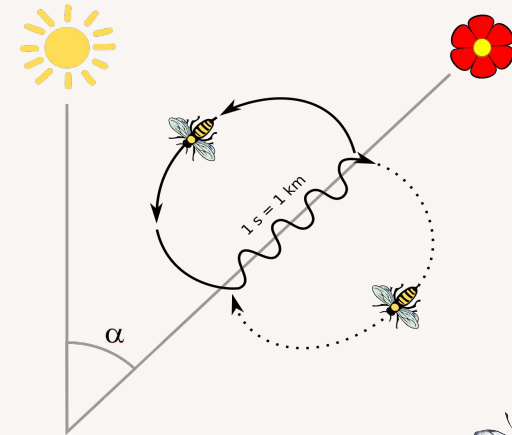
- bees are attracted to flowers from which they gather nectar
- pheromonal exchange, antennae touching
- **waggle dance**

Why ABM?

- applied to other eusocial species (ants, meerkats)
- bees don't have global information
- emergence of complex behaviour (colony task adaptation) arises from local interactions

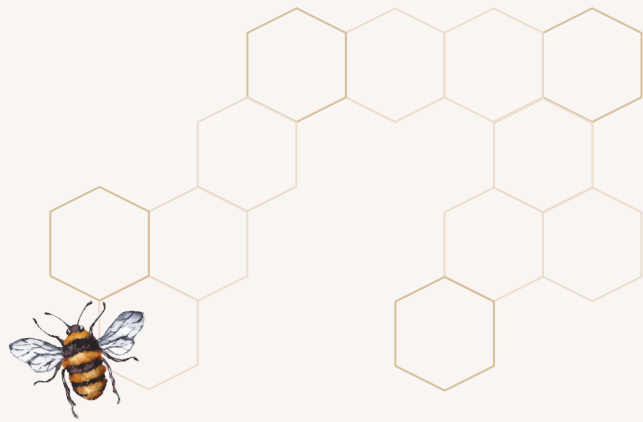


Key factors in our work: **weather** and **resource density**



Waggle dance





2. Model & Approach






Literature review



Theory

- 
1. **Beck et. Al:** *The effect of forager loss on honeybee workers temporal polyethism and social network structure* (2023)
 2. **J. Devillers:** *In silico bees* (CRC press, 2014)
 3. **B. Johnson:** *Division of labor in honeybees: form, function, and proximate mechanisms* (2010)
 4. **T. Seele:** *The Wisdom of the Hive: the social physiology of honey bee colonies* (Harvard University Press, (2009)
 5. **N. Calderone:** *Proximate mechanisms of age polyethism in the honey bee, Apis mellifera L* (1998)



Models

1. **BeeKeeper:** *PhD model* (2021)
2. **Toward a Complete Agent-Based Model of a Honeybee Colony** (2018)
3. **Bee++:** *An Object-Oriented, Agent-Based Simulator for Honey Bee Colonies* (2017)
4. **BEEHAVE:** *a systems model of honeybee colony dynamics and foraging to explore multifactorial causes of colony failure* (2014)
5. **HoPoMo:** *A model of honeybee intracolony population dynamics and resource management* (2007)

Drawbacks

- complexity
- focus
- implementation



Own model

Forager Bees

- Sensitive to weather events
- **Field of vision**,
- Current task
- Speed
- ...

Beehive

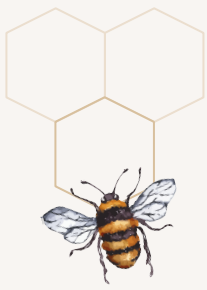
- Position
- Radius
- Nectar
- No. of young bees

Key aspects

- Continuous space
- Metropolis algorithm (*novel*)
- Weather events

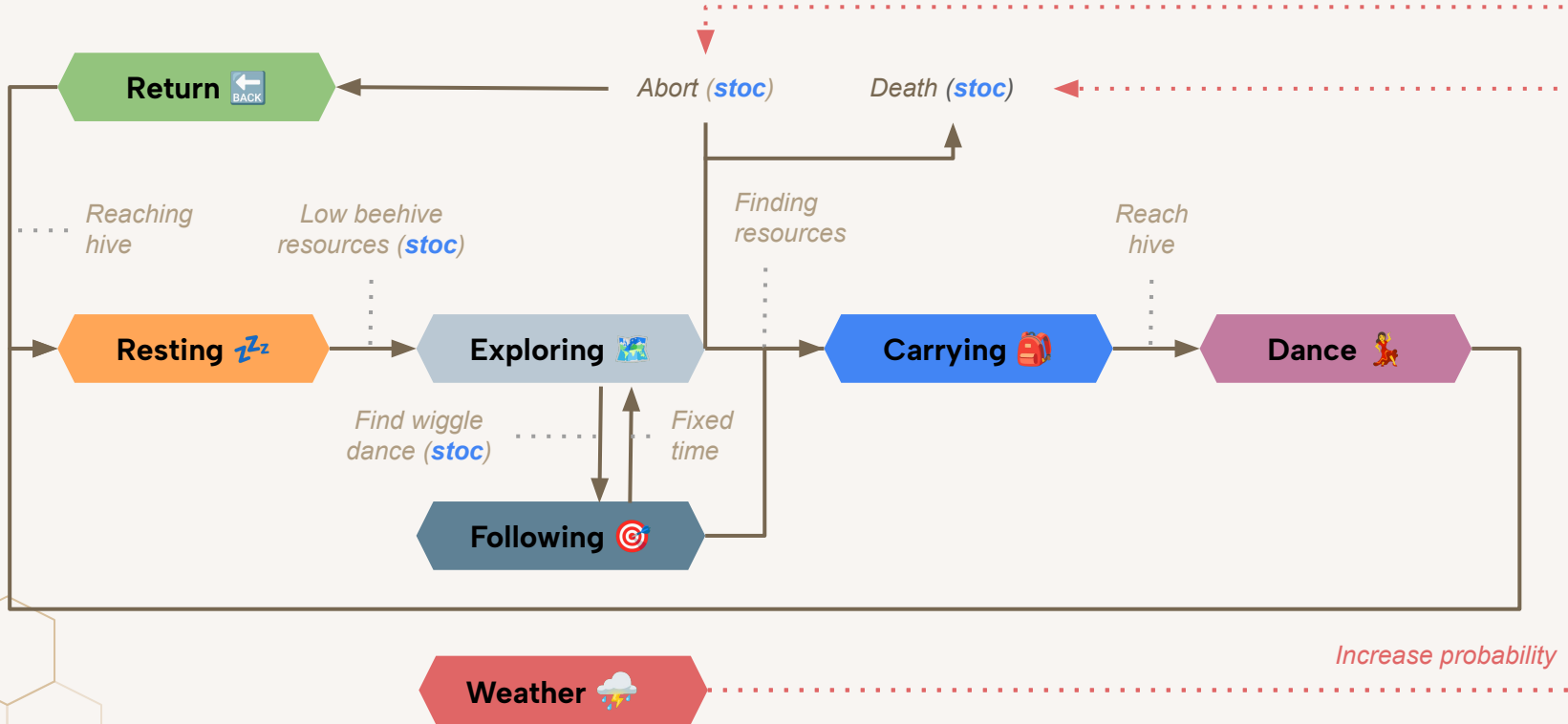
Resources

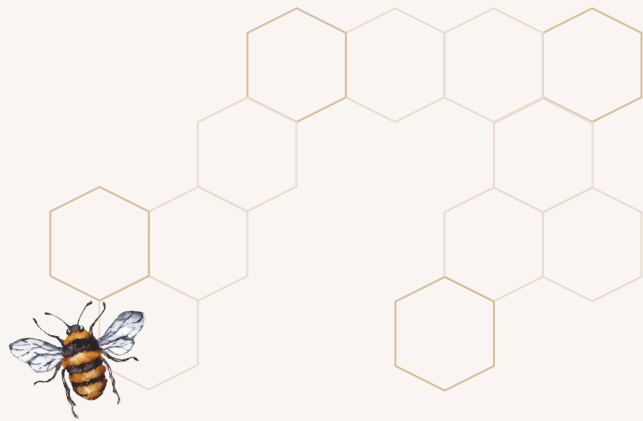
- Position
- Quantity
- Radius
- Persistence





Bee state evolution and weather impact





3. Experiments



Experiments



Baseline Assessment



1. Weather conditions

Storm rate impact on bees & bee task distribution.



2. Resource density

Resource density impact on bee task distribution.





Weather conditions

Description

Storm rate impact on bees & bee task distribution.

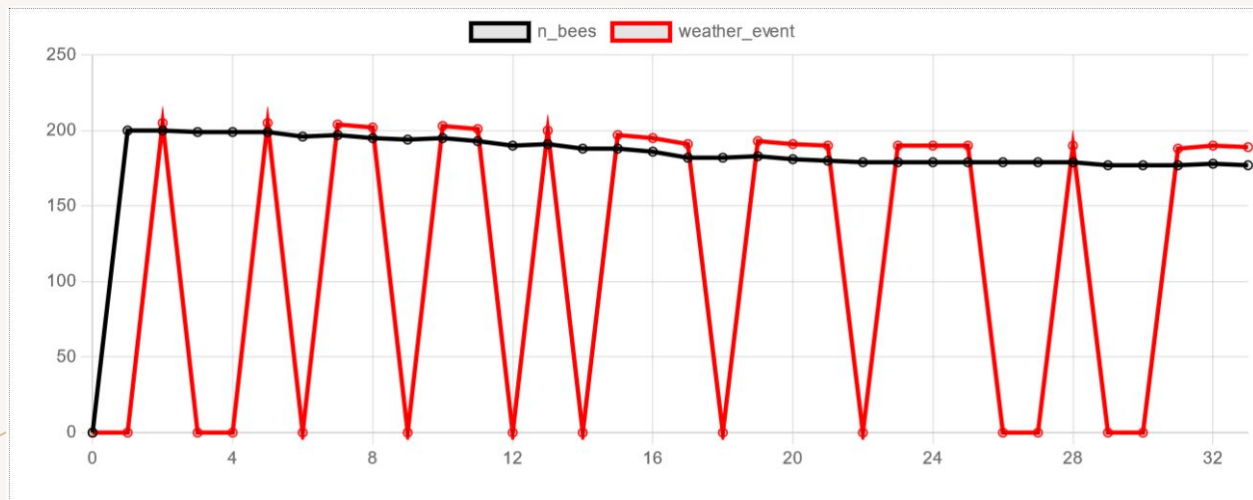
Storms

- Storm probability
- Storm duration

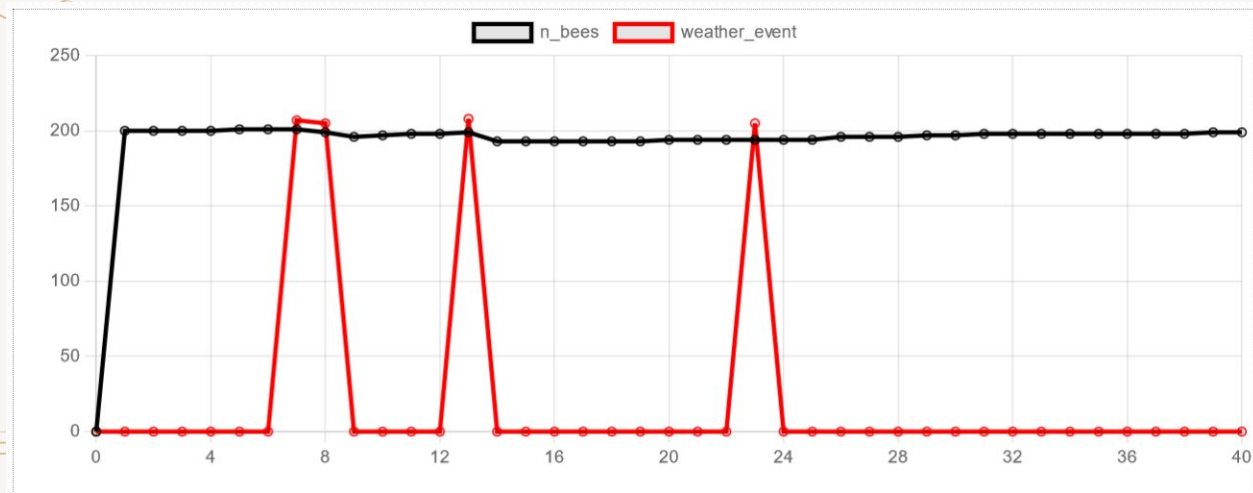
Hypothesis

As weather event kills off bees that are outside the hive, we expect the states of bees to change in order to adapt to the storm.





↑ Probability
↑ Duration



↓ Probability
↓ Duration





Resource density

Description

Resource density impact on task distribution.

Resources

- Spread
- Quantity

Hypothesis

Bees will dynamically shift their roles in order to optimize resource collection and hive maintenance

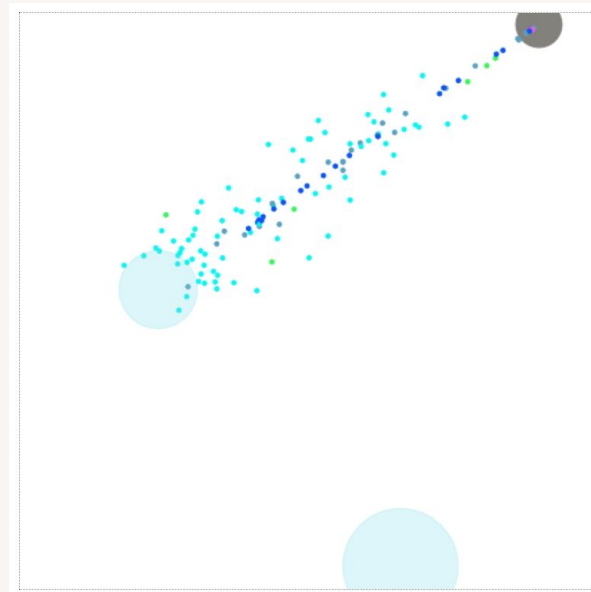
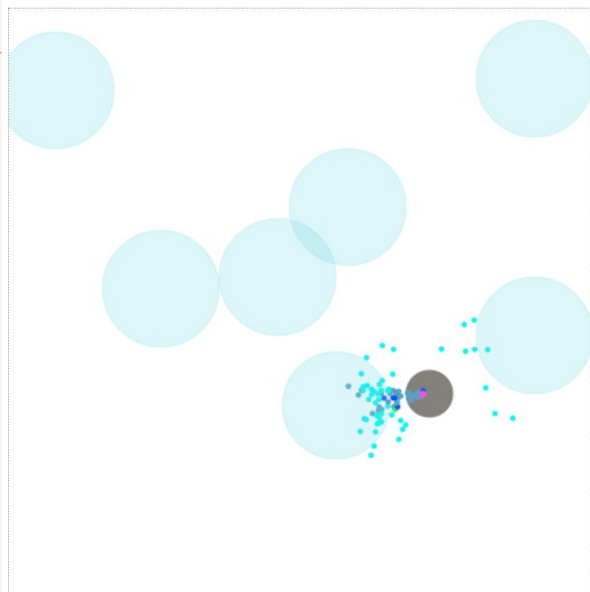


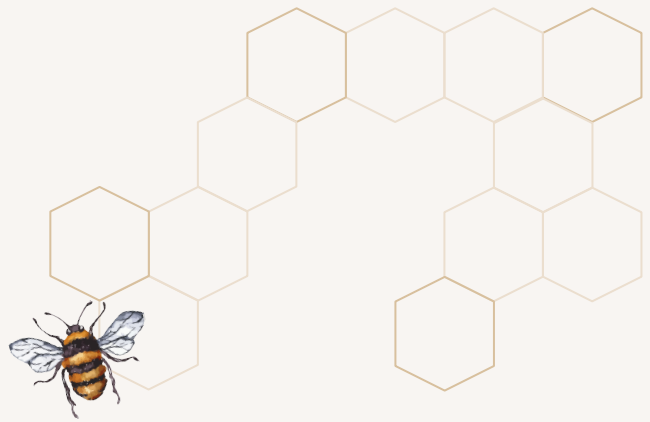


Dense



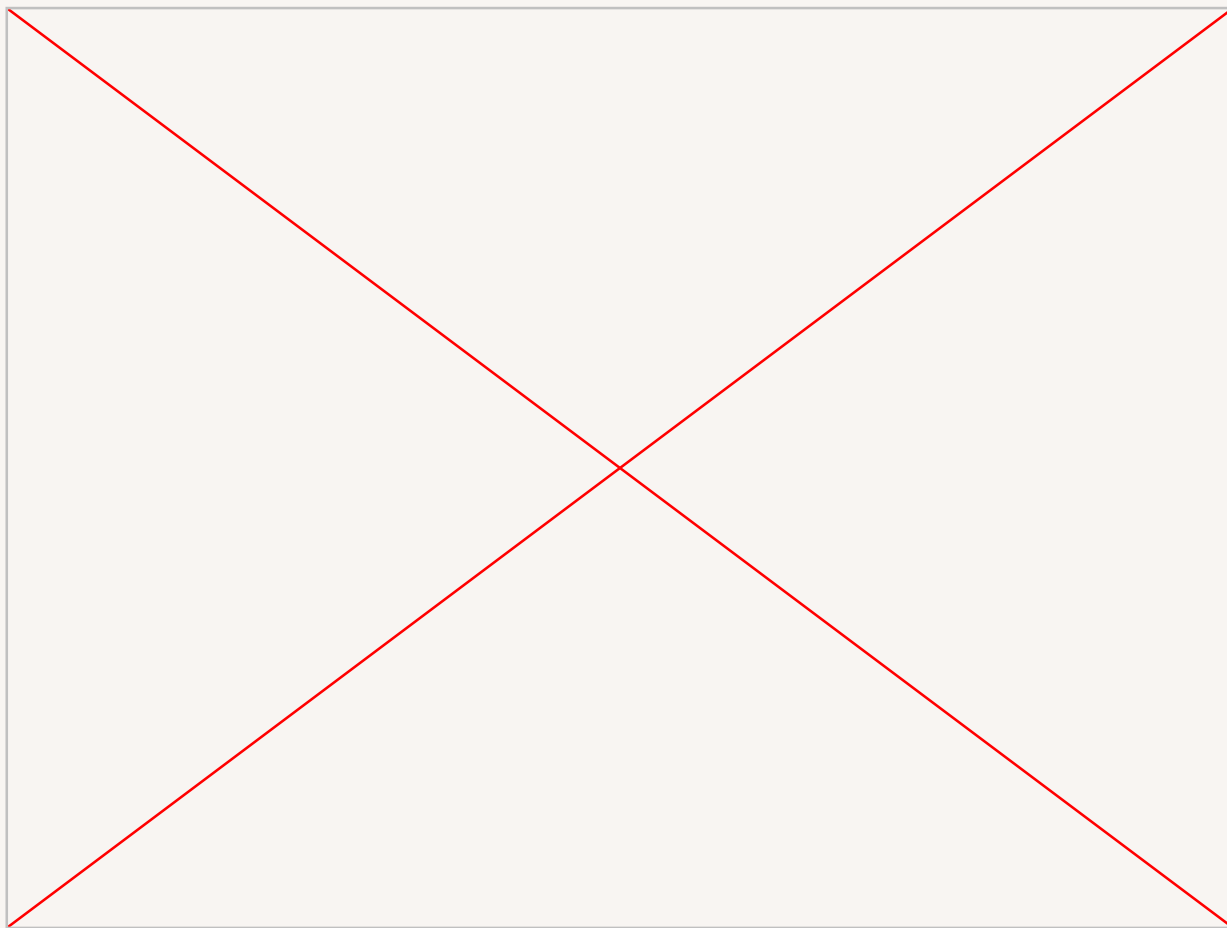
Sparse





4. Results



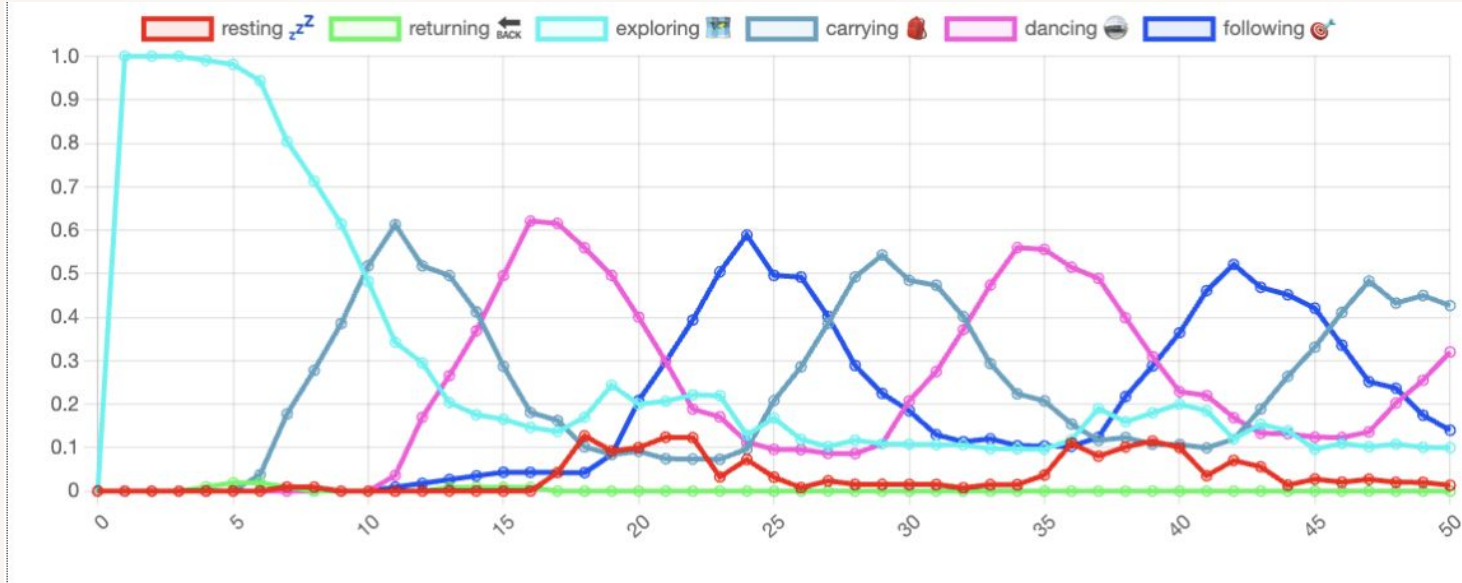


resting   returning   exploring   carrying   dancing   following  



1. Baseline & Parameter validation

Bee State proportions through time during simulation

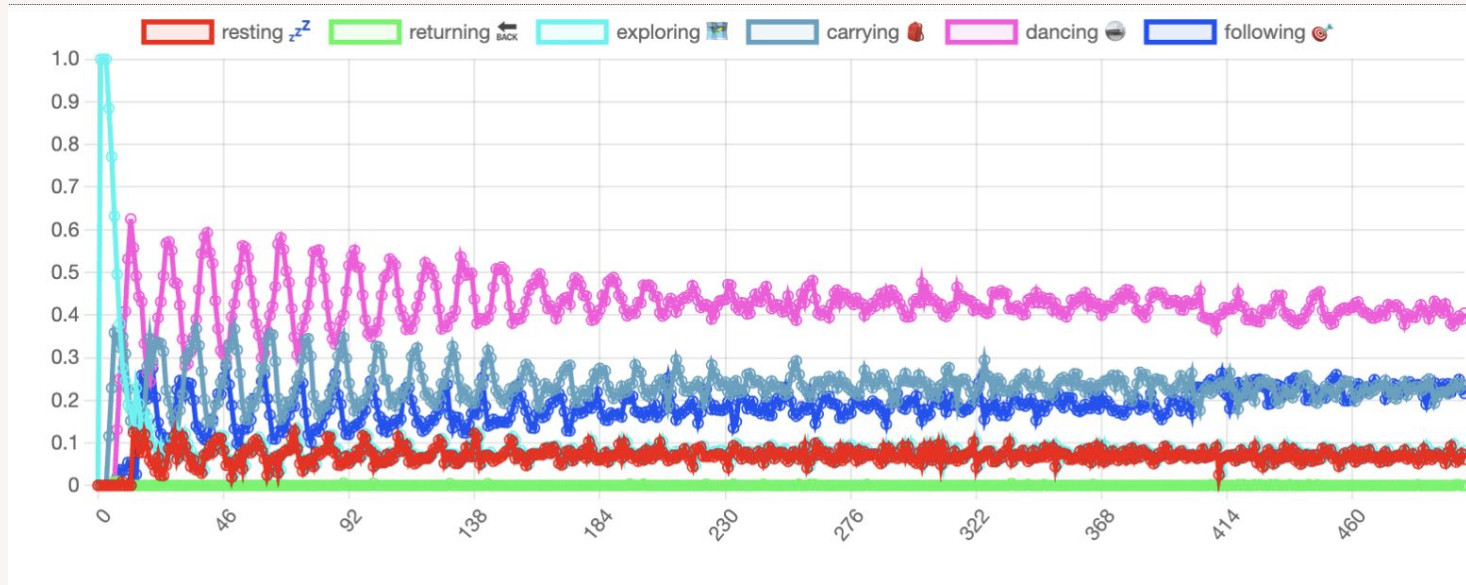


We find: Baseline with reasonable colony-level oscillatory behavior from individual rules

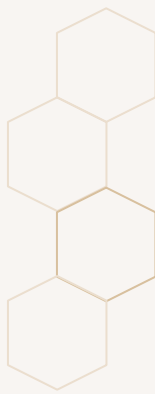


1. Baseline & Parameter validation

Bee State proportions through time during simulation (extended)

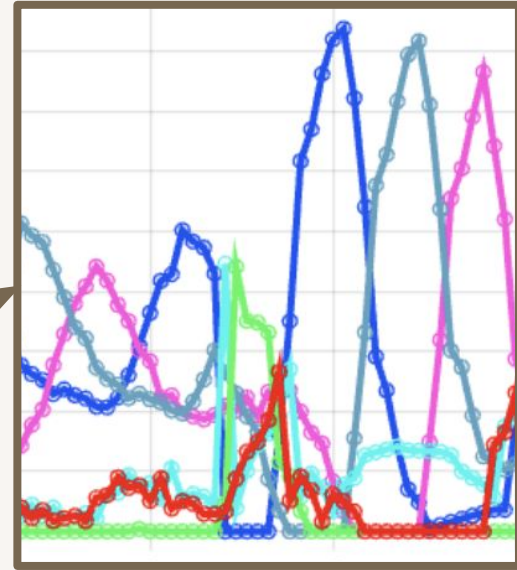
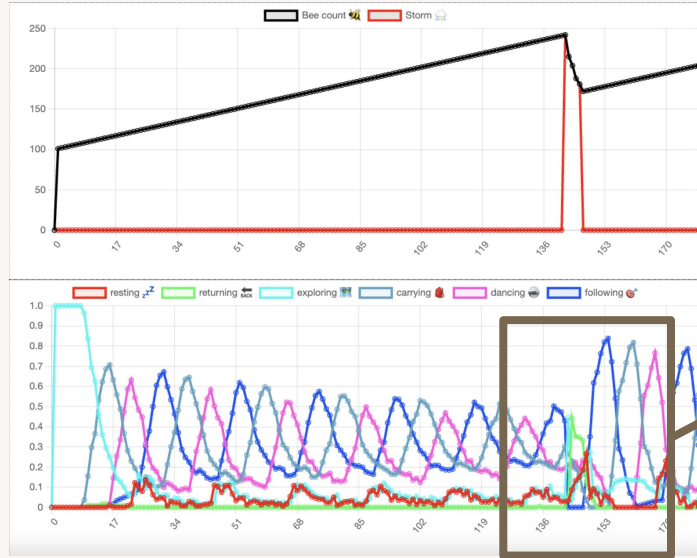


We find: Oscillations converge due to stochasticity



2. Introduction of storm events

Bee population and state proportions through time

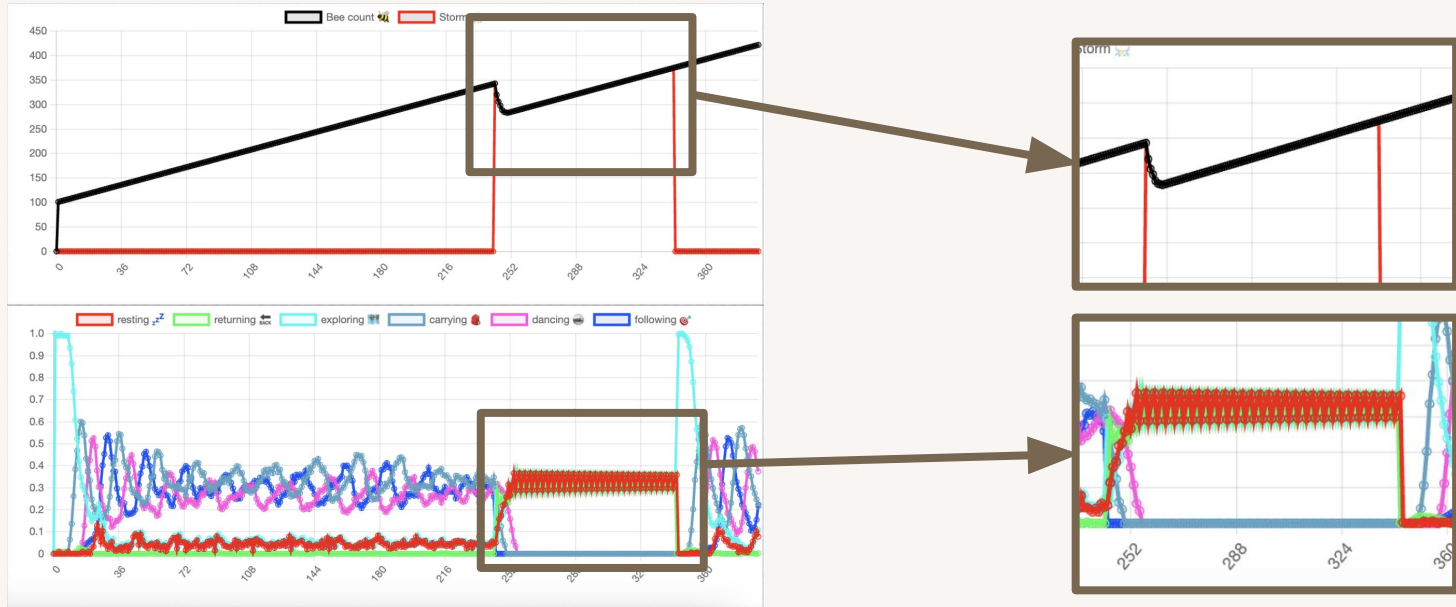


We find: Storm events reset population oscillation dynamics due to survival strategy of individual bees

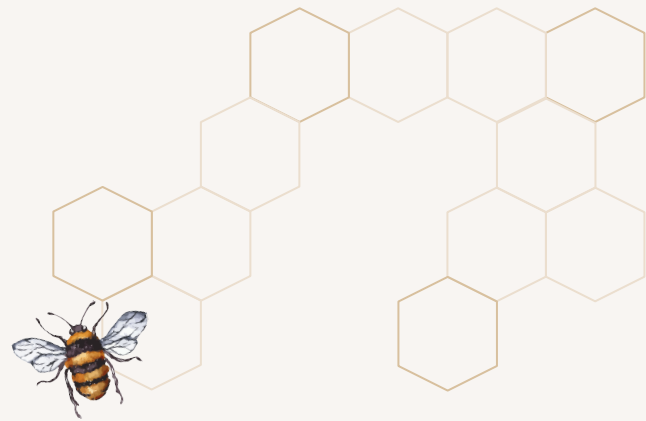


2. Introduction of storm events

Bee population and state proportions through time



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5. Conclusions & Future Works

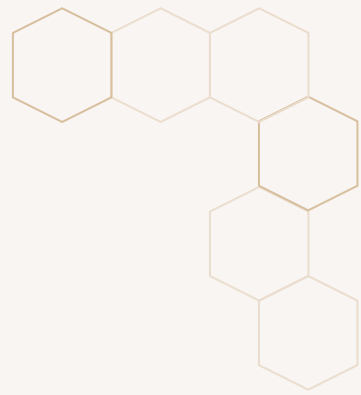




Thank you! Questions?



Bee parameters



```
FIELD_OF_VIEW = 20          # 20 (in m) TODO: calibrate further using real data
STARVATION_SPEED = 1/(60*60*24) # within 1 day (in rate/s)
MAX_AGE = (60*60*24*7*6)     # within 6 weeks (in s)
P_DEATH_BY_STORM = 1/(60*60)  # on average within 1 hour (probability) TODO: calibrate further
SPEED = 5                    # 5 (in m/s)
PERCEIVE_AS_LOW_FOOD = 2     # 2 (in kg) TODO: calibrate further
DANCING_TIME = 60            # 1 minute (in s) TODO: calibrate further
P_FOLLOW_WIGGLE_DANCE = 1    # 100% (probability) TODO: calibrate further
P_ABORT_EXPLORING = 1/(60*60) # on average within 1 hour (probability) TODO: calibrate further
P_ABORT_FOLLOWING = 1/(60*60) # on average within 1 hour (probability) TODO: calibrate further
STORM_ABORT_FACTOR = 10      # 10 times more likely to abort during storm TODO: calibrate further
CARRYING_CAPACITY = 0.001    # 1g (in kg) TODO: calibrate further
GATHERING_RATE = 0.0001      # 0.1g/s (kg/s) TODO: calibrate further
```

