

# Drivers of Diel Vertical Migration in a Changing Climate

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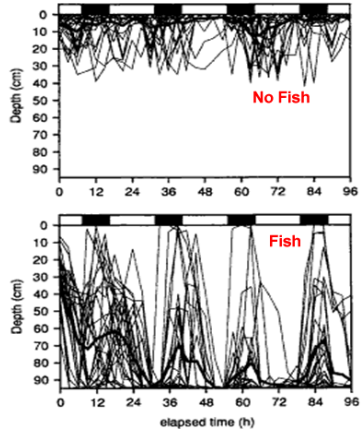
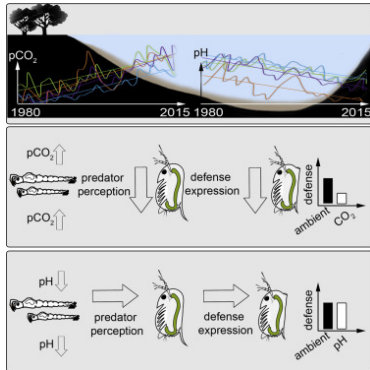


- 1 Migration dynamics of *Daphnia pulex*
- 2 A case study
- 3 Model description
- 4 System simulation
- 5 Future work

# Migration dynamics of *Daphnia pulex*

- *Daphnia pulex* (commonly known as waterflea) is a freshwater crustacean species that lives in lakes.
- Top-bottom migration dynamics.
  - ★ Shallow waters are richer in algae (food source).
  - ★ *Daphnia* are more exposed to predators in shallow waters.
- Migration triggers.
  - ★ Ultraviolet (UV) light.
  - ★ Chemical cues emitted by predators.

# Migration dynamics of *Daphnia pulex*



# Climate change and *Daphnia* migration dynamics

- Climate change is altering rainfall patterns all across the globe.
- Rainy days are associated with cloudy days.
- The center of biomass of *Daphnia* is:
  - ★ Closer to the surface in cloudy days.
  - ★ Closer to the bottom in sunny days.

# Questions of interest

- Is climate change disrupting *Daphnia* migration dynamics?
- How do different levels of UV light intensity and fear of predation affect *Daphnia* migration dynamics?

# A case study

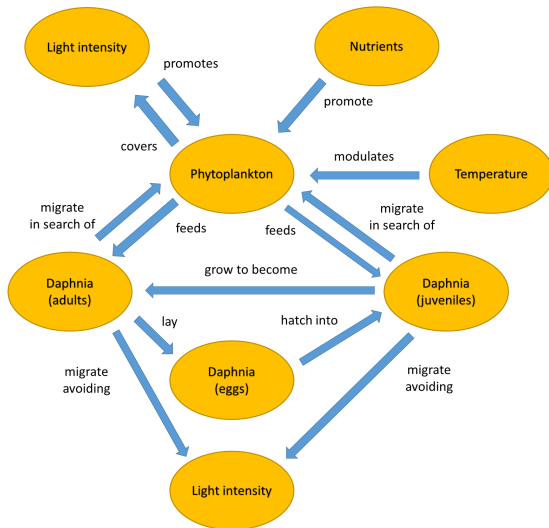
- A Membrane Computing model on the migration dynamics of *Daphnia pulex* is proposed.
- Spatially-explicit, 2D (depth  $\times$  width) model.
- Based on data from The Jefferson Project at Lake George, NY, USA.

# Model description

- An accurate model of this ecological system must represent continuous and discrete quantities.
  - ★ Membranes represent regions in the lake.
  - ★ Objects represent *Daphnia*.
  - ★ Phenomena affecting continuous quantities are captured using discrete-time finite difference equations.



# Model description



- A cross-section of the lake is modeled as a 2D (depth  $\times$  width) membrane grid.
- Lake depth varies across regions  $\implies$  The number of membranes in each column varies.

# Algae growth

- UV light intensity is attenuated by water turbidity and algae abundance  $\implies$  UV light is less intense at greater depths.
  - ★  $Lim_{Light}(z, t) =$ 
$$Lim_{Light} \times (I(0, x, t) - \frac{I(z, x, t)}{(Att(z, x, t) \times z_{max})})$$
- UV light intensity promotes algae abundance, and low nutrient concentration ( $P$  and  $C$ ) limits algae abundance.
  - ★  $[Ph(Conc_{z,x})]_{z,x} \rightarrow [Ph(Conc_{z,x} + Photo(z, x, t) - PhMort(z, x, t) - \sum_i num_{i,t} \times Conc_{z,x} \times gr)]_{z,x}$
  - ★  $Photo(z, x, t) =$ 
$$Lim_{Nut}(z, t) \times Lim_{Light}(z, x, t) \times Ph(Conc_{z,x})$$

- Nutrient concentration is larger at greater depths.

- ★  $Lim_{Nut}(z, t) =$   
 $NutLim_a \times Conc_{Nut}(t) / (NutLim_b + Conc_{Nut}(t))$

# Daphnia mortality

- *Daphnia* can die of different causes:
  - ★ Natural mortality
  - ★ Starvation
  - ★ Predation
- Changes in *Daphnia* weight are modeled as follows:

- ★  $num_{i,t+1} = num_{i,t} - Mort(num_{i,t})$

- ★  $somat_{i,t+1} = somat_{i,t} - \frac{somat_{i,t}}{Mort(num_{i,t})} + num_{i,t+1} \times Conc_{z,x} \times gr \times (1 - GonProp(somat_{i,t} + gonad_{i,t}))$

- ★  $gonad_{i,t+1} = gonad_{i,t} - \frac{gonad_{i,t}}{Mort(num_{i,t})} + num_{i,t+1} \times Conc_{z,x} \times gr \times GonProp(somat_{i,t} + gonad_{i,t})$

# *Daphnia* abundance update and reproduction

- The number of *Daphnia* and the group weights are updated:

$$\star [D_{S,num_{i,t},somat_{i,t},gonad_{i,t}}]_{z,x} \rightarrow [D_{S,num_{i,t+1},somat_{i,t+1},gonad_{i,t+1}}]_{z,x}$$

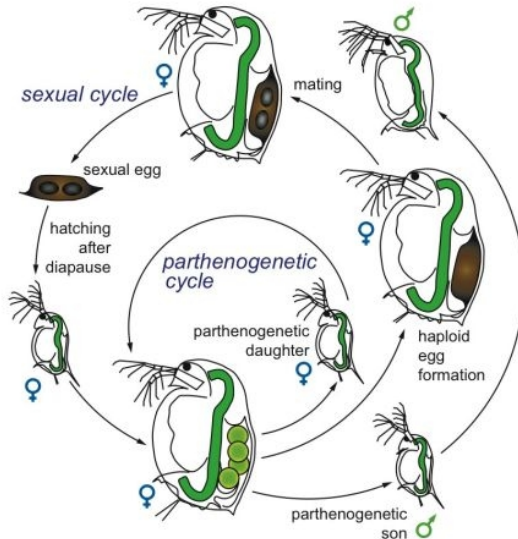
- Adults lay eggs proportionally to gonad weight.

$$\star [D_{A,num_{i,t},somat_{i,t},gonad_{i,t}}]_{z,x} \rightarrow [D_{A,num_{i,t},somat_{i,t},gonad_{i,t}-gonad_{i,t+1}/(eggw \times egg_n), Egg_0,egg_n}]_{z,x}$$

# Eggs incubate for a given time and hatch

- Eggs incubate and hatch at time  $H$ :
  - ★  $[Egg_{t,egg_n}]_{z,x} \rightarrow [Egg_{t+1,egg_n}]_{z,x}$
  - ★  $[Egg_{H,egg_n}]_{z,x} \rightarrow [D_{J_0,egg_n,somat_{0,t},0}]_{z,x}$
- Juveniles develop as egg-laying adults.
  - ★  $[D_{J_s,num,somat_{i,t},0}]_{z,x} \rightarrow [D_{J_{s+1},num,somat_{i,t},0}]_{z,x}$
  - ★  $[D_{J_a,num,somat_{i,t},0}]_{z,x} \rightarrow [D_{A,num,somat_{i,t},0}]_{z,x}$

# Daphnia lifecycle





# *Daphnia* migration dynamics

- *Daphnia* groups explore their vicinity  $diff_z, diff_x$ .
- *Daphnia* hide from predators in deep, dark waters.
- *Daphnia* migrate to shallow waters where the algae abundance is larger.

# Daphnia migration dynamics



$$[D_{s,num_{i,t},somat_{i,t},gonad_{i,t}}]_{z,x} \xrightarrow{mprob} [D_{s,num_{i,t+1},somat_{i,t+1},gonad_{i,t+1}}]_{z',x'}$$

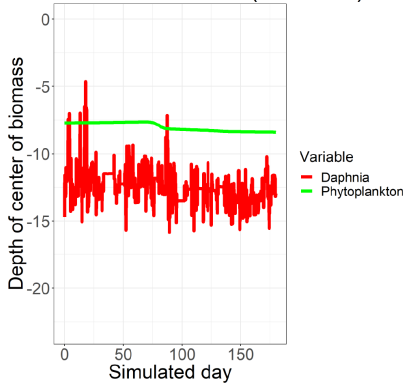
- $z - diff_z, \dots, z', \dots, z + diff_z$  and  
 $x - diff_x, \dots, x', \dots, x + diff_x$
- $mprob = \exp(-\log(0.5) \times (Conc(z', x') - Conc(z, x)) / ConcExpDiff)$
- Neighboring regions are excluded if risk of predation  $> PRP_{max}$  and UV light intensity  $> I_{max}$  tolerable

- The model was simulated for 2 years at a time scale of 1 hour and space scale of 1 meter under different cloud cover and fear of predation scenarios.
  - ★ UV light is brighter during daytime and dimmer during nighttime.
  - ★ UV light is dimmer in winter and autumn.

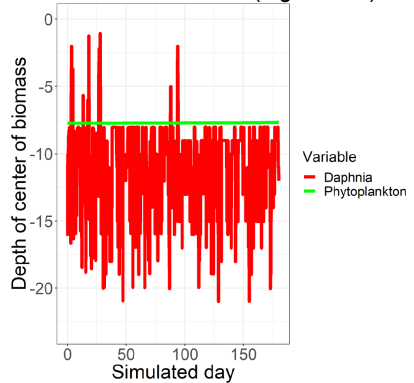
- A large proportion of cloudy days (low UV light intensity) increases *Daphnia* migration towards the water surface.
  - ★ Greater exposure to predators.

# Center of biomass of *Daphnia* and algae

Center of biomass (low cover)



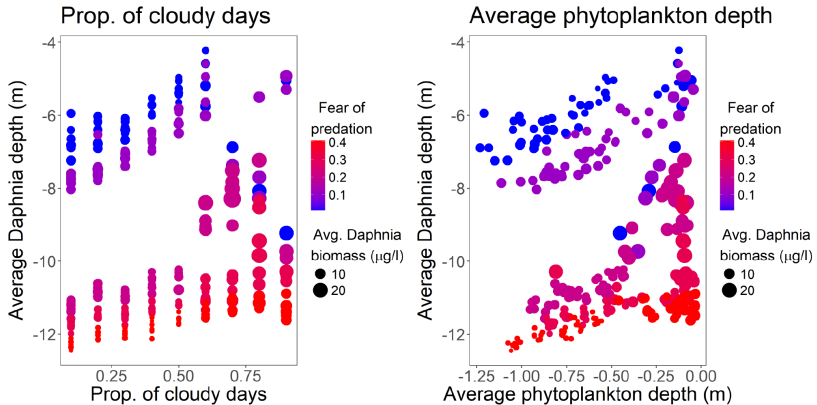
Center of biomass (high cover)



# Simulation results

- *Daphnia* abundance is larger in scenarios where the center of biomass tends towards deep waters.
  - ★ Biomass gain in shallow waters due to algae abundance and greater grazing is not compensated by predation.
- Fear of predation has a larger effect on *Daphnia* abundance than proportion of cloudy days.

# Effect of the proportion of cloudy days and fear of predation on *Daphnia* biomass



# Future work

- Predation is modeled as a depth-dependent parameter.
  - ★ It is larger in shallow waters and decays exponentially with depth.
- Need for explicit predator dynamics  $\implies$  Include predators as a (meta) species in the system.
- Water circulation plays an important role in re-distributing algae and nutrients in lake ecosystems.
  - ★ Include water circulation.
  - ★ Need for 3D dynamics  $\implies$  3D model.



Thank you!