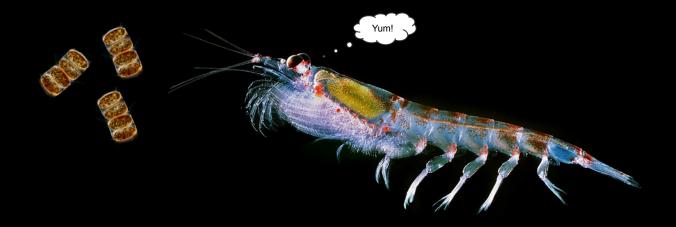
Trophic Control

Sea ice diatoms and Antarctic krill



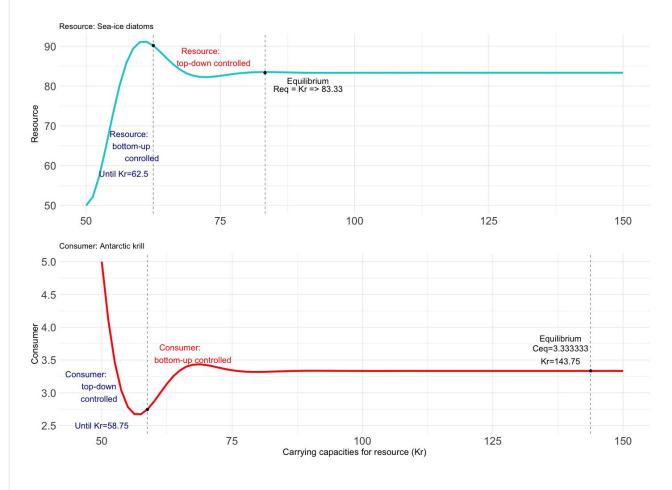
Swati Tak (s220868)

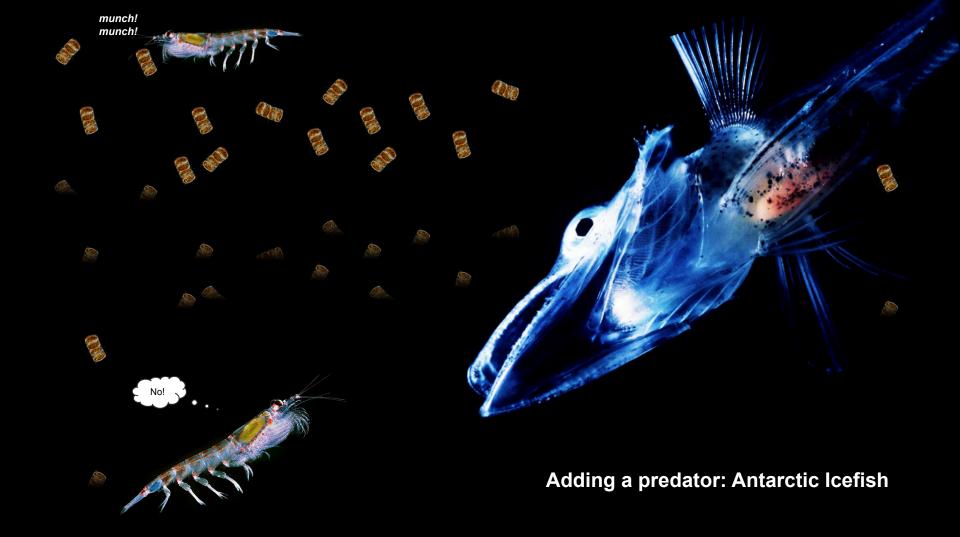
$$\frac{dR}{dt} = r R \left(1 - \frac{R}{K}\right) - b R C$$

$$\frac{dC}{dt} = E b R C - d C$$

Initial number of diatoms	R ₀ ⇒ 50
Initial number of krill	$C_0 \Rightarrow 5$
Growth rate of diatoms	r ⇒ 0.75
Clearance rate of diatoms by krill diatoms eaten per day	b ⇒ 0.1
Death rate of krill Number of krill dying per day	d ⇒ 0.5
Growth efficiency of krill per unit of diatoms consumed Number of krill attaining adulthood per unit of diatoms consumed per day	E ⇒ 0.06
Equilibrium without carrying capacity	Resource \Rightarrow d/(E * b) \Rightarrow 83.33 Consumer \Rightarrow (r/b) \Rightarrow 7.5
Actual equilibrium values obtained	Req ⇒ 83.33 Ceq ⇒ 3.333333

Bifurcation diagrams for trophic control with varying carrying capacity for resource





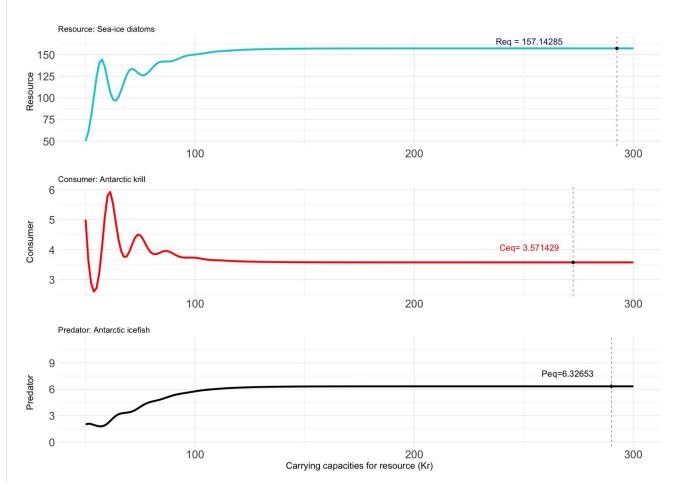
$$\frac{dR}{dt} = r R (1 - \frac{R}{K}) - b R C$$

$$\frac{dC}{dt} = E_c b R C - d_c C - a C P$$

$$\frac{dP}{dt} = E_p a C P - d_p P$$

Initial states	$R_0 \Rightarrow 50$ $C_0 \Rightarrow 5$ $P_0 \Rightarrow 2 \text{ \# predator}$ $r \Rightarrow 0.75$		
Growth rate of diatoms			
Clearance rates of diatoms by krill and krill by icefish consumption units per day	b ⇒ 0.1 a ⇒ 0.07		
Death rates for consumer and predator Numbers dying per day	death_c ⇒ 0.5 death_p ⇒ 0.2		
Growth efficiencies for consumer and predator Number of offsprings attaining adulthood per unit of consumption per day	E_c ⇒ 0.06 E_p ⇒ 0.8		
Equilibrium values obtained	Req ⇒ 157.14285 Ceq ⇒ 3.571429 Peq ⇒ 6.326530		

Adding a Predator leads to a more efficient and moderated trophic control That is, higher numbers for Resource as well as Consumer, given a suitable K.



Model extension





Bifurcation with varying death rates of the consumer

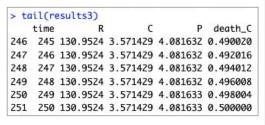
Carrying capacity for resource Kr ⇒ 250

Equilibrium values obtained

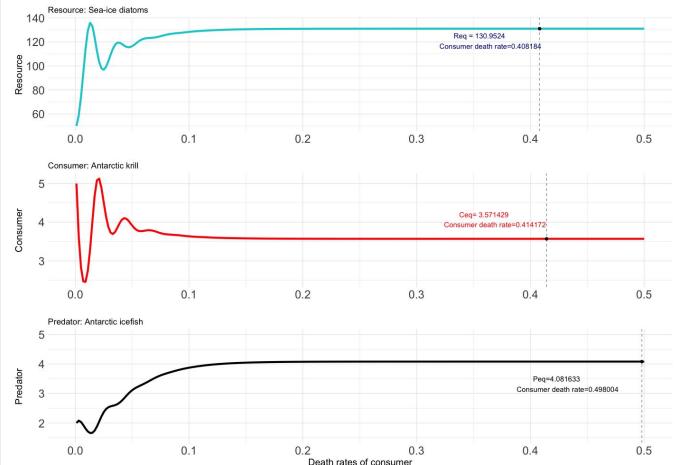
Req \Rightarrow 130.9524 Ceq \Rightarrow 3.571429 Peq \Rightarrow 4.08163

With varying death rates for consumer, the equilibrium for all three species takes slightly more time to reach.

Additionally, equilibrium population sizes for both resource and predator reduced, while that for the consumer remained unchanged.



Bifurcation diagrams for trophic control with varying death rates for consumer



> '	tail(results)			
	time	R	C	K_values	
76	75	83.33332	3.333333	143.75	
77	76	83.33333	3.333333	145.00	
78	77	83.33333	3.333333	146.25	
79	78	83.33333	3.333333	147.50	
80	79	83.33333	3.333333	148.75	
81	80	83.33333	3.333333	150.00	

Model 1: Resource + Consumer + Varying K for resource

Model 2: Resource +
Consumer + Predator +
Varying K for resource

> t	> tail(results2)						
	time	R	C	P	K_values		
196	195	157.1428	3.571429	6.32653	293.75		
197	196	157.1428	3.571429	6.32653	295.00		
198	197	157.1428	3.571429	6.32653	296.25		
199	198	157.1428	3.571429	6.32653	297.50		
200	199	157.1428	3.571429	6.32653	298.75		
201	200	157.1429	3.571429	6.32653	300.00		

Model 3: Resource +
Consumer + Predator +
Varying death rates for
consumer



> tail(results3)

	time	R	C	P	death_C
246	245	130.9524	3.571429	4.081632	0.490020
247	246	130.9524	3.571429	4.081632	0.492016
248	247	130.9524	3.571429	4.081632	0.494012
249	248	130.9524	3.571429	4.081632	0.496008
250	249	130.9524	3.571429	4.081633	0.498004
251	250	130.9524	3.571429	4.081633	0.500000

Mathematical Biology

Weekly exercie 9: Trophic Control

Swati Tak (s220868)

2023-11-06

Setting work environment

```
# Bifurcation Diagrams

## Resource: Phytoplankton

## Consumer: Zooplankton

setwd("/Users/swati/Desktop/Mathematical Biology/")
library(deSolve)
library(ggplot2)
library(patchwork)
```

Model 1: Resource, consumer and varying carrying capacities for resource

```
# Setting the parameters and initial state

r <- 0.75 # growth rate of the resource
b <- 0.1 # clearance rate of the resource by the consumer
d <- 0.5 # death rate of the consumer
E <- 0.06 # Growth efficiency of the consumer per unit of consumption

R0 <- 50 # Initial number of resource, plankton -- Thalassiosira antarctica
C0 <- 5 # Initial number of consumers -- Antarctic Krill

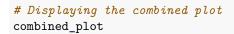
# Setting points of equilibrium without carrying capacity
Req <- d/(E * b)
Req

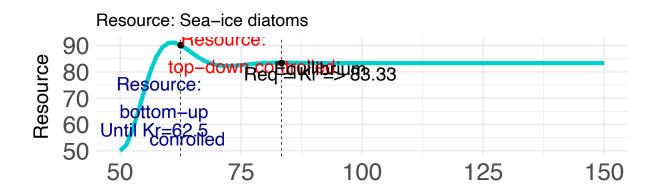
## [1] 83.33333
```

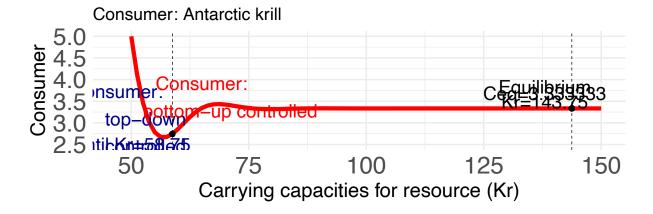
```
# Defining a function for the Lotka Volterra model using the equations
model <- function(t, state, parms) {</pre>
  with(as.list(c(state, parms)), {
    dR \leftarrow (r * (1 - (R / K_R)) * R) - (b * R * C)
    dC \leftarrow (E * b * R * C) - (d * C)
    return(list(c(dR, dC)))
  })}
# Time span
# times <- seq(0, 3000, by = 1)
times \leftarrow seq(0, 80, by = 1)
# Results from a simulation run for 3000 times gave the same equilibrium values
# Equilibrium for resource and consumer reached in a simulation of 300 steps
# Simulating multiple K values
# Adjusted to match times length
Kseq_R <- seq(R0, R0*C0-100, length.out = length(times))</pre>
# Variable to save different values of K
K_values_R <- c() # Resource K values</pre>
# Applying the model through a loop for all values of K
for (i in seq_along(Kseq_R)) {
  K_R <- Kseq_R[i]</pre>
 K_values_R <- append(K_values_R, Kseq_R[i])</pre>
  state \leftarrow c(R = R0, C = C0)
  parms \leftarrow c(E = E, b = b, r = r, d = d, K_R = K_R)
  out <- ode(y = state, times = times, parms = parms, func = model)</pre>
tail(out)
##
         time
                      R
## [76,]
          75 83.33332 3.333333
## [77,] 76 83.33333 3.333333
## [78,] 77 83.33333 3.333333
## [79,] 78 83.33333 3.333333
## [80,]
          79 83.33333 3.333333
## [81,] 80 83.33333 3.333333
# Wrangling the results
results <- as.data.frame(out)
results$K_values <- K_values_R
head(results)
     time
                           C K_values
                  R
## 1
        0 50.00000 5.000000
                                50.00
## 2
        1 52.17533 4.112117
                                51.25
## 3
        2 57.64733 3.462916
                                52.50
## 4
        3 65.04118 3.033002
                                53.75
## 5
       4 72.99487 2.783531
                                55.00
```

top-down controlled", size = annot_size, color = colors[2]) +

```
# Area where resource is bottom-up controlled
  annotate("text", x = 58, y = 65, label = "Resource:
  bottom-up
           conrolled", size = annot size, color = colors[4]) +
  annotate("text", x = 57, y = 58, label = "Until Kr=62.5", size = annot_size,
           color = colors[4]) +
  # Point where Resource attains equilibrium
  geom_point(aes(x = Req, y = Req), color = colors[3], shape = 19) +
  geom_vline(xintercept = Req, linetype = "dashed", color = colors[3],
             linewidth = 0.25) +
  # Textual annotations
  annotate("text", x = Req + 8, y = Req - 2, label = "Equilibrium",
           size = annot size) +
  annotate("text", x = Req + 8, y = Req - 4, label = "Req = Kr => 83.33",
           size = annot_size, color = colors[3]) +
  mytheme()
plot2 <- ggplot(data.frame(x = results[, 4], y = results[, 3]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[2], linewidth = 1.5) +
  labs(x = "Carrying capacities for resource (Kr)", y = "Consumer") +
  ggtitle("Consumer: Antarctic krill") +
  # Point where consumer start turning bottom-up controlled
  geom_point(aes(x = results$K_values[8], y = results$C[8]), color = colors[3],
             shape = 19) +
  geom_vline(xintercept = results$K_values[8], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = 47, y = 3.1, label = "Consumer:
           top-down
           controlled", size = annot_size, color = colors[4]) +
  annotate("text", x = 50, y = 2.5, label = "Until Kr=58.75", size = annot_size,
           color = colors[4]) +
  # Equilibrium point for consumer
  geom_point(aes(x = results$K_values[76], y = Ceq), color = colors[3],
             shape = 19) +
  geom_vline(xintercept = results$K_values[76], linetype = "dashed",
            color = colors[3], linewidth = 0.25) +
  annotate("text", x = 65, y = 3.6, label = "Consumer:
           bottom-up controlled", size = annot_size, color = colors[2]) +
  annotate("text", x = 138, y = Ceq+0.5, label = "Equilibrium",
           size = annot_size) +
  annotate("text", x = 138, y = Ceq+0.35, label = "Ceq=3.333333",
           size = annot_size, color = colors[3]) +
  annotate("text", x = 138, y = Ceq+0.15, label = "Kr=143.75",
           size = annot_size, color = colors[3]) +
  mytheme()
# Combining plots using patchwork
combined_plot <- plot1 / plot2</pre>
```







Model 2: Adding a predator that eats the consumer (krill) -> Icefish (Channichthyidae)

```
# Setting the parameters and initial state

r <- 0.75 # growth rate of the resource

b <- 0.1 # clearance rate of the resource by the consumer

death_C <- 0.5 # death rate of the consumer

E_c <- 0.06 # Growth efficiency of the consumer per unit of consumption

# Predator parameters -- new elements

a <- 0.07 # clearance rate of the consumer by the predator

death_P <- 0.2 # death rate of the predator

E_p <- 0.8 # Growth efficiency of the predator per unit of predation

# Initial states

R0 <- 50 # Initial number of resource, plankton -- Thalassiosira antarctica

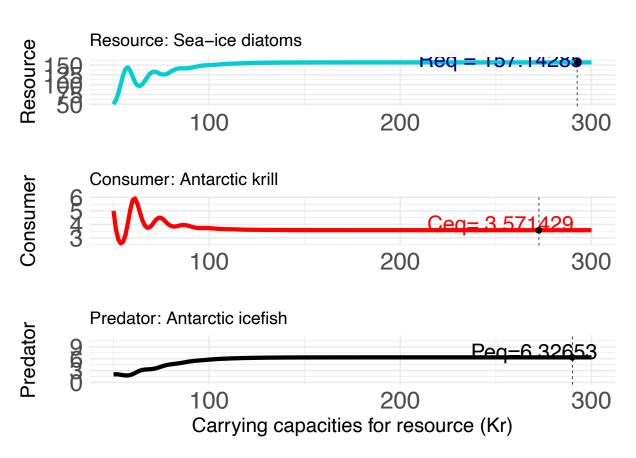
C0 <- 5 # Initial number of consumers -- Antarctic Krill

P0 <- 2 # Number of predators, Icefish (Channichthyidae)
```

```
# Redefining the model
model2 <- function(t, state, parms) {</pre>
  with(as.list(c(state, parms)), {
    dR \leftarrow (r * (1 - (R / K R))*R) - (b * R * C)
    dC \leftarrow (E_c * b * R * C) - (death_C * C) - (a * C * P)
    dP \leftarrow (E_p * a * C * P) - (death_P * P)
    return(list(c(dR, dC, dP)))
  })}
# Time span
\# times \leftarrow seq(0, 3000, by = 1)
times <- seq(0, 200, by = 1)
# Simulating multiple K values
# Adjusted to match times length
Kseq_R <- seq(R0, R0*C0*P0-200, length.out = length(times))</pre>
# Resetting the K values for the loop
K_values_R <- c()</pre>
for (i in seq_along(Kseq_R)) {
  K R <- Kseq R[i]</pre>
  K_values_R <- append(K_values_R, Kseq_R[i])</pre>
  state \leftarrow c(R = R0, C = C0, P = P0)
  parms \leftarrow c(E_c = E_c, E_p = E_p, a=a, b = b, r = r, death_C = death_C,
             death_P = death_P, K_R = K_R)
  out2 <- ode(y=state, times=times, parms = parms, func = model2)</pre>
}
# Wrangling the results
results2 <- as.data.frame(out2)
results2$K_values <- K_values_R
head(results2)
     time
                   R
                            C
                                      P K_values
## 1
        0 50.00000 5.000000 2.000000
                                           50.00
        1 60.29458 3.642621 2.079279
                                            51.25
## 3
        2 77.93478 2.884726 2.038724
                                           52.50
## 4
        3 100.74949 2.596963 1.942240
                                           53.75
## 5
        4 123.85435 2.711057 1.841617
                                           55.00
        5 140.28449 3.217132 1.776789
                                           56.25
tail(results2)
##
                             С
                                      P K_values
       time
                    R
## 196 195 157.1428 3.571429 6.32653
                                           293.75
## 197 196 157.1428 3.571429 6.32653
                                          295.00
## 198
        197 157.1428 3.571429 6.32653
                                           296.25
## 199
        198 157.1428 3.571429 6.32653
                                          297.50
## 200 199 157.1428 3.571429 6.32653
                                          298.75
## 201 200 157.1429 3.571429 6.32653
                                          300.00
```

```
Req2 <- tail(results2$R, 1)</pre>
Ceq2 <- tail(results2$C, 1)</pre>
Peq <- tail(results2$P, 1)</pre>
Req2
## [1] 157.1429
Ceq2
## [1] 3.571429
Peq
## [1] 6.32653
# Setting values for aesthetics and annotation font sizes
annot size <- 5.5
# Create separate plots for each column
plot1 <- ggplot(data.frame(x = results2[, 5], y = results2[, 2]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[1], linewidth = 1.5) +
  # Equilibrium point for resource
  geom_point(aes(x = results2$K_values[195], y = results2$R[195]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results2$K_values[195], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results2$K_values[195]-40, y = results2$R[195]+8,
           label = "Req = 157.14285", size = annot_size, colour=colors[4]) +
  labs(x = "", y = "Resource") +
  ggtitle("Resource: Sea-ice diatoms") +
  mytheme()
plot2 <- ggplot(data.frame(x = results2[, 5], y = results2[, 3]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[2], linewidth = 1.5) +
  # Equilibrium point for consumer
  geom_point(aes(x = results2$K_values[179], y = results2$C[179]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results2$K_values[179], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results2$K_values[179]-20, y = results2$C[179]+0.5,
           label = "Ceq= 3.571429", size = annot_size, colour=colors[2]) +
  labs(x = "", y = "Consumer") +
  ggtitle("Consumer: Antarctic krill") +
  mytheme()
```

```
plot3 <- ggplot(data.frame(x = results2[, 5], y = results2[, 4]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[3], linewidth = 1.5) +
  # Equilibrium point for predator
  geom_point(aes(x = results2$K_values[193], y = results2$P[193]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results2$K_values[193], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results2$K_values[193]-20, y = results2$P[193]+1.5,
           label = "Peq=6.32653", size = annot_size, colour=colors[3]) +
  ylim(0, Peq+5) +
  labs(x = "Carrying capacities for resource (Kr)", y = "Predator") +
  ggtitle("Predator: Antarctic icefish") +
  mytheme()
# Combine plots using patchwork
combined_plot2 <- plot1 / plot2 / plot3</pre>
# Display the combined plot
combined_plot2
```



Model 3 – Extension: Changing the values of consumer's death rates

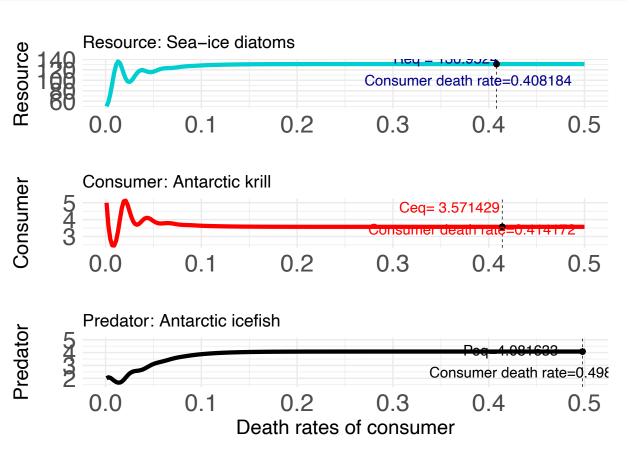
```
# Setting the parameters and initial state
r <- 0.75 # growth rate of the resource
K_R <- 250 # Carrying capacity for resource</pre>
b <- 0.1 # clearance rate of the resource by the consumer
E_c <- 0.06 # Growth efficiency of the consumer per unit of consumption
# Setting time steps
\# times \leftarrow seq(0, 3000, by = 1)
times <- seq(0, 250, by = 1)
# Simulating multiple values for consumer's death rate
# Adjusted to match times length
death_C_seq <- seq(0.001, 0.5, length.out = length(times))</pre>
# Resetting consumer's death rate values for the loop
death_C_values <- c()</pre>
# Predator parameters -- new elements
a <- 0.07 # clearance rate of the consumer by the predator
death_P <- 0.2 # death rate of the predator</pre>
E_p \leftarrow 0.8 # Growth efficiency of the predator per unit of predation
# Initial states
RO <- 50 # Initial number of resource, plankton -- Thalassiosira antarctica
{\tt CO} <- {\tt 5} # Initial number of consumers -- Antarctic Krill
PO <- 2 # Number of predators, Icefish (Channichthyidae)
# Redefining the model
model2 <- function(t, state, parms) {</pre>
  with(as.list(c(state, parms)), {
    dR \leftarrow (r * (1 - (R / K_R))*R) - (b * R * C)
    dC \leftarrow (E_c * b * R * C) - (death_C * C) - (a * C * P)
    dP \leftarrow (E_p * a * C * P) - (death_P * P)
    return(list(c(dR, dC, dP)))
  })}
for (i in seq_along(death_C_seq)) {
  death_C <- death_C_seq[i]</pre>
  death_C_values <- append(death_C_values, death_C_seq[i])</pre>
  state \leftarrow c(R = R0, C = C0, P = P0)
  parms \leftarrow c(E_c = E_c, E_p = E_p, a=a, b = b, r = r, death_C = death_C,
              death_P = death_P, K_R = K_R)
  out3 <- ode(y=state, times=times, parms = parms, func = model2)</pre>
tail(out3)
```

```
time
                  R
## [246,] 245 130.9524 3.571429 4.081632
## [247,] 246 130.9524 3.571429 4.081632
## [248,] 247 130.9524 3.571429 4.081632
## [249,] 248 130.9524 3.571429 4.081632
## [250,] 249 130.9524 3.571429 4.081633
## [251.] 250 130.9524 3.571429 4.081633
head((out3))
       time
                     R
## [1,]
        0 50.00000 5.000000 2.000000
## [2,]
          1 58.82661 3.627606 2.078667
## [3,]
        2 74.26799 2.830600 2.034411
## [4,]
        3 94.05524 2.472476 1.928830
        4 114.10358 2.459617 1.810377
## [5,]
## [6,]
           5 129.30968 2.747641 1.712580
# Wrangling the results
results3 <- as.data.frame(out3)</pre>
results3$death_C <- death_C_values
head(results3)
     time
                  R
                           C
                                    P death C
      0 50.00000 5.000000 2.000000 0.001000
## 1
       1 58.82661 3.627606 2.078667 0.002996
## 2
## 3
       2 74.26799 2.830600 2.034411 0.004992
       3 94.05524 2.472476 1.928830 0.006988
       4 114.10358 2.459617 1.810377 0.008984
## 5
## 6
       5 129.30968 2.747641 1.712580 0.010980
tail(results3)
       time
                   R
                           C
                                     P death C
## 246 245 130.9524 3.571429 4.081632 0.490020
## 247 246 130.9524 3.571429 4.081632 0.492016
## 248 247 130.9524 3.571429 4.081632 0.494012
## 249 248 130.9524 3.571429 4.081632 0.496008
## 250 249 130.9524 3.571429 4.081633 0.498004
## 251 250 130.9524 3.571429 4.081633 0.500000
Req3 <- tail(results3$R, 1)</pre>
Ceq3 <- tail(results3$C, 1)</pre>
Peq2 <- tail(results3$P, 1)</pre>
Req3
```

[1] 130.9524

```
Ceq3
## [1] 3.571429
Peq2
## [1] 4.081633
Peq
## [1] 6.32653
# Setting values for aesthetics and annotation font sizes
annot_size <- 4
colors <- c("darkturquoise", "red", "black", "darkblue")</pre>
# Create separate plots for each column
plot1 <- ggplot(data.frame(x = results3[, 5], y = results3[, 2]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[1], linewidth = 1.5) +
  # Equilibrium point for resource
  geom_point(aes(x = results3$death_C[205], y = results3$R[205]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results3$death_C[205], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results3\$death_C[205]-0.053, y = results3\$R[205]-10,
  label = "Req = 130.9524
           Consumer death rate=0.408184", size = annot_size, colour=colors[4]) +
  labs(x = " ", y = "Resource") +
  ggtitle("Resource: Sea-ice diatoms") +
  mytheme()
plot2 <- ggplot(data.frame(x = results3[, 5], y = results3[, 3]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[2], linewidth = 1.5) +
  # Equilibrium point for consumer
  geom_point(aes(x = results3$death_C[208], y = results3$C[208]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results3$death_C[208], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results3\$death_C[208] - 0.055, y = results3\$C[208] + 0.5,
  label = "Ceq= 3.571429
           Consumer death rate=0.414172", size = annot_size, colour=colors[2]) +
  labs(x = " ", y = "Consumer") +
  ggtitle("Consumer: Antarctic krill") +
  mytheme()
```

```
plot3 <- ggplot(data.frame(x = results3[, 5], y = results3[, 4]),</pre>
                aes(x = x, y = y)) +
  geom_line(color = colors[3], linewidth = 1.5) +
  ylim(1.5,5) +
  # Equilibrium point for predator
  geom_point(aes(x = results3$death_C[250], y = results3$P[250]),
             color = colors[3], shape = 19) +
  geom_vline(xintercept = results3$death_C[250], linetype = "dashed",
             color = colors[3], linewidth = 0.25) +
  annotate("text", x = results3\$death_C[250]-0.075, y = results3\$P[250]-0.75,
  label = "Peq=4.081633
           Consumer death rate=0.498004", size = annot_size, colour=colors[3]) +
  labs(x = "Death rates of consumer", y = "Predator") +
  ggtitle("Predator: Antarctic icefish") +
  mytheme()
# Combine plots using patchwork
combined_plot3 <- plot1 / plot2 / plot3</pre>
# Display the combined plot
combined_plot3
```



Printing the results for three models

```
# Print all results
tail(results)
```

```
C K_values
      time
                  R
       75 83.33332 3.333333
## 76
                               143.75
## 77
       76 83.33333 3.333333
                               145.00
## 78
       77 83.33333 3.333333
                               146.25
       78 83.33333 3.333333
## 79
                               147.50
       79 83.33333 3.333333
## 80
                               148.75
       80 83.33333 3.333333
## 81
                               150.00
```

tail(results2)

```
##
                            С
                                    P K_values
       time
                  R
## 196 195 157.1428 3.571429 6.32653
                                        293.75
       196 157.1428 3.571429 6.32653
                                        295.00
       197 157.1428 3.571429 6.32653
## 198
                                        296.25
       198 157.1428 3.571429 6.32653
                                        297.50
## 199
## 200
       199 157.1428 3.571429 6.32653
                                        298.75
## 201 200 157.1429 3.571429 6.32653
                                        300.00
```

tail(results3)

```
## time R C P death_C ## 246 245 130.9524 3.571429 4.081632 0.490020 ## 247 246 130.9524 3.571429 4.081632 0.492016 ## 248 247 130.9524 3.571429 4.081632 0.492016 ## 249 248 130.9524 3.571429 4.081632 0.496008 ## 250 249 130.9524 3.571429 4.081633 0.498004 ## 251 250 130.9524 3.571429 4.081633 0.500000
```