# sensitivity

## **Getting dependencies**

# Hypothetical parameters

```
# Define hypothetical transition parameters
hyp_p3 <- list(
  b_a=0.8,  # adult pairing propensity
  b_y=0.8,  # young adult pairing propensity
  m=0.48,  # chick production.
  r=0.5,  #sex ratio
  sigma_j = 0.45^(12/34),  #juv survival
  sigma_a=0.92,  # Adult survival
  sigma_y=0.92  # young adult survival
)
hyp_p2 <- list(
  b=0.8,  # adult pairing propensity</pre>
```

```
m=0.48, # chick production.
r=0.5, #sex ratio
sigma_j = 0.45^(12/34), #juv survival
Pa=0.92 # Adult survival
)
```

### **Comparing lambdas**

Here I compare lambdas of different matrices. I need to confirm all matrices have the same lambdas when all parameters are the same. This means all matrices are collapsing correctly.

```
# construct matrix
lam2 <- constructMatrix2(hyp_p2)$lam2
lam3 <- constructMatrix3(hyp_p3)$lam3
lam4 <- constructMatrix4(hyp_p2)$lam4
lam7 <- constructMatrix7(hyp_p3)$lam7

tibble(lam2,lam4,lam7,lam3) %>%
    knitr::kable()
```

lam2	lam4	lam7	lam3
0.9974851	0.9974851	0.9974851	0.9974851

### **Functions**

#### 3 to 2 matrix parameter collapse function

When given a parameter list for 3 stage matrix, this function can calculate and return a list of parameters for the 2 stage matrix.

test if lambda is the same after collapsing

```
b_test_p3 <- list(
  b_a=0.6,  # adult pairing propensity
  b_y=0.7,  # young adult pairing propensity
  m=0.48,  # chick production.
  r=0.5,  #sex ratio
  sigma_j = 0.45^(12/34),  #juv survival
  sigma_a=0.92,  # Adult survival
  sigma_y=0.92  # young adult survival
)

b_test_p2 <- param_collapse(b_test_p3)

constructMatrix2(b_test_p2)$lam2 == constructMatrix3(b_test_p3)$lam3</pre>
```

#### [1] TRUE

```
p_test_p3 <- list(
  b_a=0.8,  # adult pairing propensity
  b_y=0.8,  # young adult pairing propensity
  m=0.48,  # chick production.
  r=0.5,  #sex ratio
  sigma_j = 0.45^(12/34),  #juv survival
  sigma_a=0.93,  # Adult survival
  sigma_y=0.7  # young adult survival
)

p_test_p2 <- param_collapse(p_test_p3)

constructMatrix2(p_test_p2)$lam2 == constructMatrix3(p_test_p3)$lam3</pre>
```

#### [1] FALSE

## **Plotting lamdas**

### heat map

for sigma\_a and sigma\_y and Pa

```
# Create a grid of sigma_y and sigma_a values
sigma_y_values <- seq(0.5, 0.94, by = 0.03)
sigma_a_values <- seq(0.5, 0.97, by = 0.03)

# Initialize a data frame to store results
heatmap_data <- data.frame(sigma_a = numeric(0), sigma_y = numeric(0), lam3 =
    numeric(0), Pa = numeric(0))

# Iterate through all combinations of sigma_y and sigma_a
for (sigma_y in sigma_y_values) {
    for (sigma_a in sigma_a_values) {
        # Update the parameter list
        param_list <- list(
            sigma_y = sigma_y,
            sigma_a = sigma_a,
            b_a = 0.6, # example value</pre>
```

```
b_y = 0.6, # example value
      m = 1.5, # example value
      r = 0.5, # example value
      sigma_j = 0.45^(12/34) # example value
    # Calculate lam3 and Pa
    construct_result <- constructMatrix3(param_list)</pre>
    p_collapsed <- param_collapse(param_list)</pre>
    # Append the result to the data frame
    heatmap_data <- rbind(heatmap_data, data.frame(</pre>
      sigma_a = sigma_a,
      sigma_y = sigma_y,
      lam3 = construct_result$lam3,
      Pa = p_collapsed$Pa
    ))
  }
}
interest_Pa <- seq(0.78, 0.94, by = 0.03)
# Compare each Pa with all others and add an outline flag
heatmap data <- heatmap data %>%
  mutate(outline = "N/A") %>% # Set default outline as "N/A"
  mutate(outline = sapply(Pa, function(current Pa) {
    # Check if current_Pa is within 0.005 of any value in interest_Pa
    matched_Pa <- sapply(interest_Pa, function(target_Pa) {abs(current_Pa -</pre>

    target_Pa) <= 0.005})</pre>
    # If matched, return the Pa value; otherwise, return "N/A"
    if (any(matched_Pa)) {paste("Pa =", interest_Pa[which(matched_Pa)])}

    else {"N/A"}

  }))
# Generate a color palette for each Pa group
n_groups <- length(unique(heatmap_data$outline))</pre>
group_colors <- scales::hue_pal()(n_groups)</pre>
group_colors[1] <- "transparent"</pre>
# Plot the heatmap
```

```
ggplot(heatmap_data, aes(x = sigma_y, y = sigma_a, fill = lam3)) +
 geom tile(aes(color = outline), size = 1.5) + # Use Pa group for the color

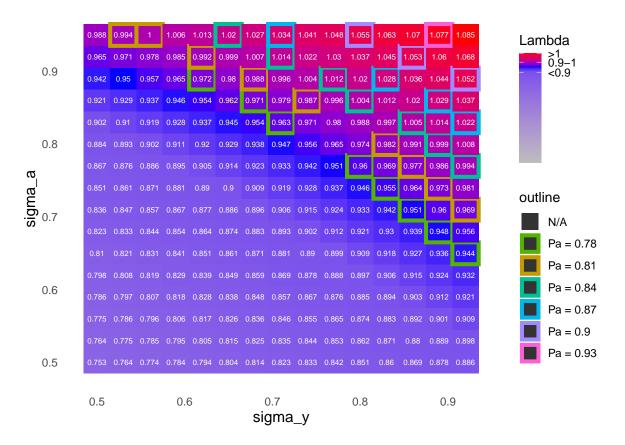
→ outline

 geom_text(aes(label = round(lam3, digits = 3)), color = "white", size = 2)
 scale_color_manual(values = setNames(group_colors,

    unique(heatmap_data$outline))) + # Apply color palette

 scale_fill_gradientn(
   colors = c("gray", "blue", "red"),
   values = scales::rescale(c(0, 0.9, 1, 1.086)),
   limits = c(0, 1.086),
   breaks = c(0.9, 1, 1.086),
   labels = c("<0.9", "0.9-1", ">1"),
   name = "Lambda"
 labs(x = "sigma_y", y = "sigma_a", title = "Heatmap of Lambda with Pa") +
 theme_minimal() +
 theme(
   panel.grid = element_blank(),
   axis.title = element_text(size = 12),
   plot.title = element_text(hjust = 0.5, size = 14)
```

### Heatmap of Lambda with Pa



```
b_y_values <- seq(0.5, 0.9, by = 0.03)
b_a_values <- seq(0.5, 0.93, by = 0.03)

# Initialize a data frame to store results
heatmap_data <- data.frame(b_a = numeric(0), b_y = numeric(0), lam3 =
    numeric(0), b = numeric(0))

# Iterate through all combinations of sigma_y and sigma_a
for (b_y in b_y_values) {
    for (b_a in b_a_values) {
        # Update the parameter list
        param_list <- list(
            sigma_y = 0.8,
            sigma_a = 0.8,
            b_a = b_a, # example value
            b_y = b_y, # example value</pre>
```

```
m = 1.5, # example value
      r = 0.5, # example value
      sigma_j = 0.45^(12/34) # example value
    # Calculate lam3 and Pa
    construct_result <- constructMatrix3(param_list)</pre>
    b_collapsed <- param_collapse(param_list)</pre>
    # Append the result to the data frame
    heatmap_data <- rbind(heatmap_data, data.frame(</pre>
      b_a = b_a
      b_y = b_y
      lam3 = construct_result$lam3,
      b = b_collapsed$b
    ))
  }
interest_b <- seq(0.5, 0.9, by = 0.1)
# Compare each Pa with all others and add an outline flag
heatmap_data <- heatmap_data %>%
  mutate(outline = "N/A") %>% # Set default outline as "N/A"
  mutate(outline = sapply(b, function(current_b) {
    # Check if current_Pa is within 0.005 of any value in interest_Pa
    matched_b <- sapply(interest_b, function(target_b) {abs(current_b -</pre>

    target_b) <= 0.005})</pre>
    # If matched, return the Pa value; otherwise, return "N/A"
    if (any(matched_b)) {paste("b =", interest_b[which(matched_b)])} else
     }))
# Generate a color palette for each Pa group
n_groups <- length(unique(heatmap_data$outline))</pre>
group_colors <- setNames(scales::hue_pal()(n_groups),</pre>

¬ unique(heatmap_data$outline))

group_colors["N/A"] <- "transparent"</pre>
# Plot the heatmap
```

```
ggplot(heatmap_data, aes(x = b_y, y = b_a, fill = lam3)) +
  geom_tile(aes(color = outline), size = 1.5) + # Use Pa group for the color

→ outline

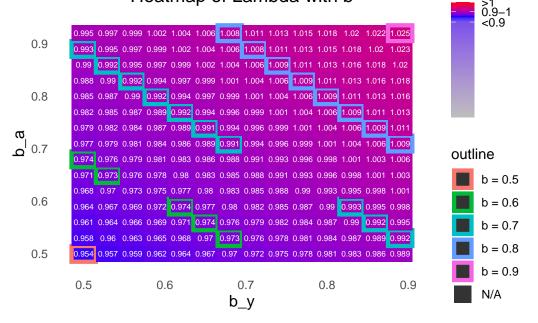
 geom_text(aes(label = round(lam3, digits = 3)), color = "white", size = 2)
 scale_color_manual(values = setNames(group_colors,

    unique(heatmap_data$outline))) + # Apply color palette

  scale_fill_gradientn(
    colors = c("gray", "blue", "red"),
   values = scales::rescale(c(0, 0.9, 1, 1.086)),
   limits = c(0, 1.086),
   breaks = c(0.9, 1, 1.086),
   labels = c("<0.9", "0.9-1", ">1"),
   name = "Lambda"
  labs(x = "b_y", y = "b_a", title = "Heatmap of Lambda with b") +
  theme_minimal() +
  theme(
    panel.grid = element_blank(),
    axis.title = element_text(size = 12),
   plot.title = element_text(hjust = 0.5, size = 14)
```

Lambda





### different pairing propensity

```
b_{value} < - seq(0, 0.9, by = 0.02)
# Initialize a data frame to store results
all_b_lam3 <- data.frame(b = numeric(0), lam3 = numeric(0))</pre>
# Iterate through paired combinations
for (i in 1:length(b_value)) {
 b <- b_value[i]</pre>
 hyp_p3$b_a <- b
 hyp_p3$b_y <- b
  # Run constructMatrix3 and calculate lam3
 lam3 <- constructMatrix3(hyp_p3)$lam3</pre>
 # Store the current lam3 along with b
  all_b_lam3 <- rbind(all_b_lam3, data.frame(b = b, lam3 = lam3))}</pre>
# Calculate log sensitivity: (log difference of lam3 over log difference of
all_b_lam3$log_sensitivity <- c(NA, diff(log(all_b_lam3$lam3)) /

    diff(log(all_b_lam3$b)))

# Calculate log elasticity: (b / lam3) * log_sensitivity
all b_lam3$log_elasticity <- c(NA, (all_b_lam3$b[-1] / all_b_lam3$lam3[-1]) *

    diff(log(all_b_lam3$lam3)) / diff(log(all_b_lam3$b)))

b_{sensitivity_plot} \leftarrow ggplot(all_b_lam3, aes(x = b, y = log_sensitivity)) +
  geom_line(color = "red") +
 labs(x = "breeding propensity",
       y = "absolute sensitivity (dLam3/db)") +
  scale_x_continuous(limits = c(0, 0.9))
b_elasticity_plot <- ggplot(all_b_lam3, aes(x = b, y = log_elasticity)) +
  geom_line(color = "blue") +
  labs(x = "breeding propensity",
       y = "Elasticity") +
  scale_x_continuous(limits = c(0, 0.9))
```

```
b_{lam} line plot <- ggplot(all_b_lam3, aes(x = b, y = lam3)) +
  geom_line()+
  labs(x = "breeding propensity",
        y = "Lambda") +
  scale_x_continuous(limits = c(0, 0.9)) +
  scale_y_continuous(limits = c(0.8, 1.05))
params <- ggplot() +</pre>
    annotate("text", x = 0.5, y = 0.5,
             label = paste("m =", hyp_p3$m, "\n",
                            "r =",hyp_p3$r,"\n",
                            "sigma_j =", hyp_p3$sigma_j,"\n",
                            "sigma_a =",hyp_p3$sigma_a,"\n",
                            "sigma_y =",hyp_p3$sigma_y,"\n",
                            "b 0-0.9"
                            ),
             size = 4, hjust = 0.5, vjust = 0.5) +
    theme_void()
b_lam_annotated <- ggarrange(b_lam_line_plot,b_sensitivity_plot,</pre>

    b_elasticity_plot, params, ncol = 4, nrow = 1)
```

#### different chick production

```
m_value <- seq(0.3, 0.6, by = 0.02)

# Initialize a data frame to store results
all_m_lam3 <- data.frame(m = numeric(0), lam3 = numeric(0))

# Iterate through paired combinations
for (i in 1:length(m_value)) {
    m <- m_value[i]
    hyp_p3$m <- m

# Run constructMatrix3 and calculate lam3
    lam3 <- constructMatrix3(hyp_p3)$lam3

# Store the current lam3 along with m
    all_m_lam3 <- rbind(all_m_lam3, data.frame(m = m, lam3 = lam3))}</pre>
```

```
# Calculate log sensitivity: (log difference of lam3 over log difference of
\rightarrow m)
all_m_lam3$log_sensitivity <- c(NA, diff(log(all_m_lam3$lam3)) /

    diff(log(all_m_lam3$m)))
# Calculate log elasticity: (m / lam3) * log_sensitivity
all_m_lam3$log_elasticity <- c(NA, (all_m_lam3$m[-1] / all_m_lam3$lam3[-1]) *

    diff(log(all m lam3$lam3)) / diff(log(all m lam3$m)))

m_sensitivity_plot <- ggplot(all_m_lam3, aes(x = m, y = log_sensitivity)) +</pre>
  geom_line(color = "red") +
  labs(x = "chick production",
       y = "absolute sensitivity (dLam3/dm)") +
  scale_x_continuous(limits = c(0, 0.9))
m_elasticity_plot <- ggplot(all_m_lam3, aes(x = m, y = log_elasticity)) +</pre>
  geom_line(color = "blue") +
  labs(x = "chick production",
       y = "Elasticity") +
  scale_x_continuous(limits = c(0, 0.9))
m_{\text{line_plot}} \leftarrow ggplot(all_m_lam3, aes(x = m, y = lam3)) +
  geom line()+
  labs(x = "chick production",
        y = "Lambda") +
  scale_x_continuous(limits = c(0.3, 0.6)) +
  scale_y_continuous(limits = c(0.8, 1.05))
params <- ggplot() +</pre>
    annotate("text", x = 0.5, y = 0.5,
             label = paste("b_y =", hyp_p3b_y, "\n",
                            "b_a = ", hyp_p3$b_a, "\n",
                            "r =",hyp_p3$r,"\n",
                            "sigma_j =", hyp_p3$sigma_j,"\n",
                            "sigma_a =",hyp_p3$sigma_a,"\n",
                            "sigma_y =",hyp_p3$sigma_y,"\n",
                            "m 0.3-0.6"
             size = 4, hjust = 0.5, vjust = 0.5) +
    theme void()
```

#### different sex-ratio

```
r value \leftarrow seq(0.3, 0.6, by = 0.02)
# Initialize a data frame to store results
all r lam3 <- data.frame(r = numeric(0), lam3 = numeric(0))
# Iterate through paired combinations
for (i in 1:length(r_value)) {
  r <- r_value[i]
  hyp_p3$r <- r
  # Run constructMatrix3 and calculate lam3
  lam3 <- constructMatrix3(hyp_p3)$lam3</pre>
  # Store the current lam3 along with r
  all_r_lam3 \leftarrow rbind(all_r_lam3, data.frame(r = r, lam3 = lam3))
# Calculate log sensitivity: (log difference of lam3 over log difference of
all_r_lam3$log_sensitivity <- c(NA, diff(log(all_r_lam3$lam3)) /

    diff(log(all_r_lam3$r)))

# Calculate log elasticity: (m / lam3) * log_sensitivity
all_r_lam3$log_elasticity <- c(NA, (all_r_lam3$r[-1] / all_r_lam3$lam3[-1]) *

    diff(log(all_r_lam3$lam3)) / diff(log(all_r_lam3$r)))

r_sensitivity_plot <- ggplot(all_r_lam3, aes(x = r, y = log_sensitivity)) +
  geom_line(color = "red") +
  labs(x = "sex ratio",
       y = "absolute sensitivity (dLam3/dm)") +
  scale_x_continuous(limits = c(0, 0.9))
r_{elasticity_plot} \leftarrow ggplot(all_r_lam3, aes(x = r, y = log_elasticity)) +
  geom_line(color = "blue") +
```

```
labs(x = "sex ratio",
       y = "Elasticity") +
  scale_x_continuous(limits = c(0, 0.9))
r_{\text{lam\_line\_plot}} \leftarrow ggplot(all_r_lam3, aes(x = r, y = lam3)) +
  geom_line()+
  labs(x = "sex ratio",
        y = "Lambda")+
  scale x continuous(limits = c(0.3, 0.6))+
  scale_y_continuous(limits = c(0.8, 1.05))
params <- ggplot() +</pre>
    annotate("text", x = 0.5, y = 0.5,
             label = paste("b_y =", hyp_p3b_y, "\n",
                            "b_a = ", hyp_p3$b_a, "\n",
                            "m =",hyp_p3$m,"\n",
                            "sigma_j =", hyp_p3$sigma_j,"\n",
                            "sigma_a =",hyp_p3$sigma_a,"\n",
                            "sigma_y =",hyp_p3$sigma_y,"\n",
                            "r 0.3-0.6"
                            ),
             size = 4, hjust = 0.5, vjust = 0.5) +
    theme_void()
r_lam_annotated <- ggarrange(r_lam_line_plot,r_sensitivity_plot,

    r_elasticity_plot, params, ncol = 4, nrow = 1)
```

### different juvenile survival

```
s <- seq(0.2, 0.5, by = 0.02)
sigma_j_value <- s^(12/34)

# Initialize a data frame to store results
all_sigma_j_lam3 <- data.frame(sigma_j = numeric(0), lam3 = numeric(0))

# Iterate through paired combinations
for (i in 1:length(sigma_j_value)) {
    sigma_j <- sigma_j_value[i]
    hyp_p3$sigma_j <- sigma_j</pre>
```

```
# Run constructMatrix3 and calculate lam3
  lam3 <- constructMatrix3(hyp_p3)$lam3</pre>
  # Store the current lam3 along with r
  all_sigma_j_lam3 <- rbind(all_sigma_j_lam3, data.frame(sigma_j = sigma_j,
 \rightarrow lam3 = lam3))}
# Calculate log sensitivity: (log difference of lam3 over log difference of
\rightarrow m)
all_sigma_j_lam3$log_sensitivity <- c(NA, diff(log(all_sigma_j_lam3$lam3)) /

    diff(log(all_sigma_j_lam3$sigma_j)))
# Calculate log elasticity: (m / lam3) * log_sensitivity
all_sigma_j_lam3$log_elasticity <- c(NA, (all_sigma_j_lam3$sigma_j[-1] /
→ all_sigma_j_lam3$lam3[-1]) * diff(log(all_sigma_j_lam3$lam3)) /

    diff(log(all_sigma_j_lam3$sigma_j)))
sigma_j_sensitivity_plot <- ggplot(all_sigma_j_lam3, aes(x = sigma_j, y =</pre>
→ log_sensitivity)) +
  geom_line(color = "red") +
  labs(x = "juvenile survival",
       y = "absolute sensitivity (dLam3/dm)") +
  scale_x_continuous(limits = c(0, 0.9))
sigma_j_elasticity_plot <- ggplot(all_sigma_j_lam3, aes(x = sigma_j, y =
→ log elasticity)) +
  geom_line(color = "blue") +
  labs(x = "juvenile survival",
       y = "Elasticity") +
  scale_x_continuous(limits = c(0, 0.9))
sigma_j_lam_line_plot <- ggplot(all_sigma_j_lam3, aes(x = sigma_j, y = lam3))
  geom_line()+
  labs(x = "juvenile survival",
        y = "Lambda") +
  scale_x continuous(limits = c(min(sigma_j_value), max(sigma_j_value)))+
  scale_y_continuous(limits = c(0.8, 1.05))
params <- ggplot() +</pre>
    annotate("text", x = 0.5, y = 0.5,
             label = paste("b_y =", hyp_p3b_y, "\n",
```

