Figures

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```
set.seed(1)
att.param \leftarrow list(n1 = 500,
                   n2 = 0,
                   b1 = 0.65,
                   b2 = 0.65,
                   k1 = 500,
                   k2 = 500,
                   a12 = 1,
                   a21 = 1,
                   a11 = 1,
                   a22 = 1,
                   del1 = 0,
                   del2 = 2)
singleWindow.time.param <- list(tau = 1/52,</pre>
                                  time.invade = 0,
                                  time.window = 52,
                                  time.index = 520)
source("parameter/modelParam.R")
source("simulations/alphaSim.R")
source("statistics/singleWindowStat.R")
```

```
## This is GoeVeg 0.7.2 - build: 2024-02-06
```

```
source("simulations/halfAndHalf.R")
source("statistics/ROCcurveData.R")
```

1. Outcomes of Model

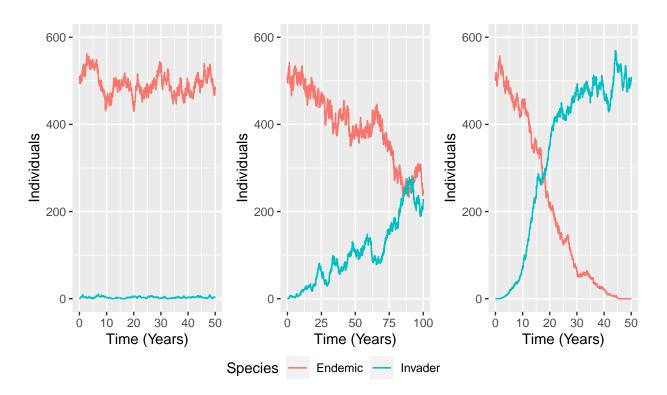
These plots display the three outcomes of the Lotka-Volterra Competition model: endemic survival, coexistence, and invader success.

```
library(ggplot2)
library(cowplot)
library(gridExtra)
library(grid)

df.endemic <- alphaSim(att.param, singleWindow.time.param, ratio.max=0.5, ttb=25, do.win=FALSE)</pre>
```

```
df.coexistence <- alphaSim(att.param, singleWindow.time.param, ratio.max=1, ttb=50, do.win=FALSE)
df.invader <- alphaSim(att.param, singleWindow.time.param, ratio.max=2.0, ttb =25, do.win=FALSE)
endemic.plot <- ggplot(data=df.endemic, aes(x=time)) +</pre>
                  geom_line(aes(y=endemic, color="Endemic")) +
                  geom_line(aes(y=invader, color="Invader")) +
                  xlab("Time (Years)") +
                  ylab("Individuals") + theme(legend.position = "none") + ylim(c(0,600))
coexistence.plot <- ggplot(data=df.coexistence, aes(x=time)) +</pre>
                      geom_line(aes(y=endemic, color="Endemic")) +
                      geom_line(aes(y=invader, color="Invader")) +
                      xlab("Time (Years)") +
                      ylab("Individuals") + theme(legend.position = "none") + ylim(c(0,600))
invader.plot <- ggplot(data=df.invader, aes(x=time)) +</pre>
                  geom_line(aes(y=endemic, color="Endemic")) +
                  geom_line(aes(y=invader, color="Invader")) +
                  xlab("Time (Years)") +
                  ylab("Individuals") + theme(legend.position="bottom") + guides(color= guide_legend(ti
legend <- get_legend(invader.plot)</pre>
## Warning: Removed 1 row containing missing values ('geom_line()').
## Removed 1 row containing missing values ('geom_line()').
grid.arrange(textGrob("Species Abundance", gp=gpar(size=32)), endemic.plot, coexistence.plot, invader.p
             ncol=3, nrow = 3,
             layout_matrix = rbind(c(1,1,1), c(2,3,4), c(5,5,5)),
             widths = c(10,10,10), heights = c(0.5, 2.5, 0.2))
## Warning: Removed 1 row containing missing values ('geom_line()').
## Removed 1 row containing missing values ('geom_line()').
## Removed 1 row containing missing values ('geom_line()').
## Removed 1 row containing missing values ('geom_line()').
```

Species Abundance



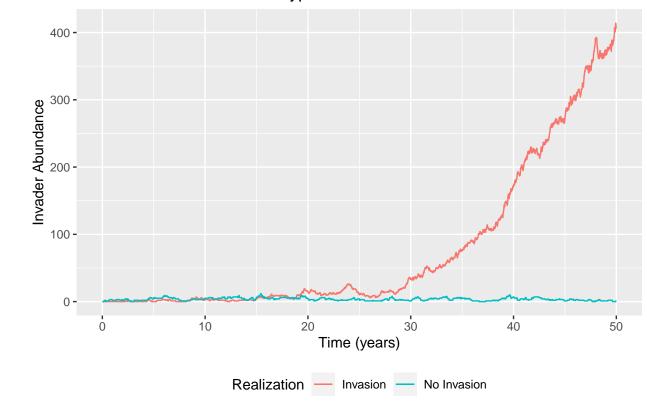
2. Two Types of Realizations

```
library(ggplot2)
df.invaderWin <- alphaSim(att.param, singleWindow.time.param, ratio.max=2, ttb=25, do.win=TRUE)
df.invaderLose <- alphaSim(att.param, singleWindow.time.param, ratio.max=0.5, ttb=25, do.win=FALSE)

df.realizations <- cbind(df.invaderWin, df.invaderLose)
colnames(df.realizations) <- c("time1", "endemic1", "invader1", "ratio1", "time2", "endemic2", "invader

ggplot(data=df.realizations, aes(x=time1)) + geom_line(aes(y=invader1, color="Invasion")) + geom_line(aes(y=invasion)) + geom
```

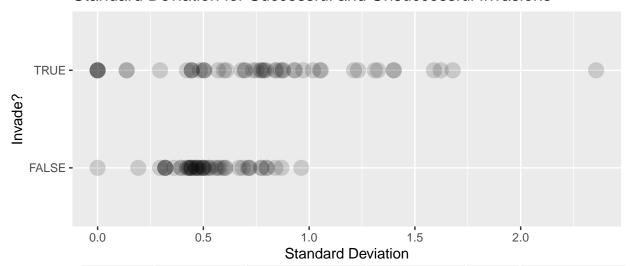
Invader abundance for two types of realizations



3. Single Window Statistics

```
library(gridExtra)
library(ggplot2)
df.test <- halfAndHalf(att.param,</pre>
                       singleWindow.time.param,
                       ttb=25,
                       halfSimulations=50,
                       win.ratio=2,
                       fail.ratio=0.1)
df.SD <- singleWindowStat(df.data=df.test,</pre>
                          time.window=52,
                          time.index=520,
                          func="sd")
endemic.data = data.frame(endemic=c(att.param[1],att.param[3],att.param[5],att.param[7],att.param[9],att
colnames(endemic.data) = c('Initial N', 'Birth Rate', 'Carrying Cap.', 'Initial Inter.', 'Intra.', 'Imm
invader.data = data.frame(invader=c(att.param[2],att.param[4],att.param[6],att.param[8],att.param[10],a
colnames(invader.data) = c('Initial N', 'Birth Rate', 'Carrying Cap.', 'Initial Inter.', 'Intra.', 'Imm
parameters = rbind(endemic.data, invader.data)
rownames(parameters) = c("endemic", 'invader')
time.parameters = as.data.frame(t(c('1 Week', '10 Years', '1 Year', '50 each')))
colnames(time.parameters) = c('Tau', 'Window Start', 'Window Length', 'Realizations')
```

Standard Deviation for Successful and Unsuccessful Invasions



	Initial N	Birth Rate	Carrying Cap.	Initial Inter.	Intra.	Immigration
endemic	500	0.65	500	1	1	0
invader	0	0.65	500	1	1	2

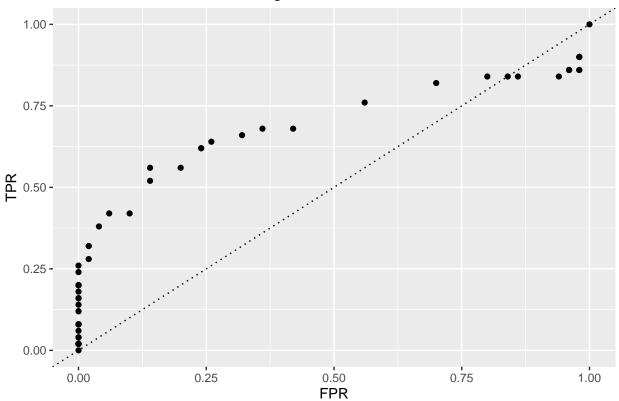
	Tau	Window Start	Window Length	Realizations
value	1 Week	10 Years	1 Year	50 each

ROC Curve for Single Stat

```
library(DescTools)
df.rates <- ROCcurveData(df.SD, numThresholds = 75, inequality = ">")
auc <- AUC(x=df.rates$FPR, y=df.rates$TPR, method='trapezoid')</pre>
```

```
## Warning in regularize.values(x, y, ties, missing(ties), na.rm = na.rm):
## collapsing to unique 'x' values
```

TPR vs. FPR for SD as a diagnostic



4. Several Statistics and Realization Types

```
library(goeveg)
library(moments)
# increasing ratio
df.increasing <- halfAndHalf(att.param, singleWindow.time.param, ttb=25, halfSimulations=50, win.ratio=
# constant ratio: a12 > a21
df.constant <- halfAndHalf(att.param, singleWindow.time.param, ttb=25, halfSimulations=50, win.ratio=2,
#statistics
stats <- c("mean", "sd", "cv", "kurtosis", "skewness")</pre>
inequalities <- c(">", ">", "<", "<", "<")
windows <- c(52,104,156)
time.index=520
singleStatWindows <- function(df.data, windows, time.index, statsNum) {</pre>
  df1 <- singleWindowStat(df.data, time.window=windows[1], time.index, func=stats[statsNum])</pre>
  df2 <- singleWindowStat(df.data, time.window=windows[2], time.index, func=stats[statsNum])
  df3 <- singleWindowStat(df.data, time.window=windows[3], time.index, func=stats[statsNum])
  df.stat.type <- cbind(df1,df2,df3)</pre>
  colnames(df.stat.type) = c("do.win", "stat1", "do.win2", "stat2", "do.win3", "stat3")
  return(df.stat.type)
}
dfListing <- function(df.increasing, df.constant, stats) {</pre>
```

```
statsList = list()
for(i in 1:length(stats)) {
    df.stat.increasing = singleStatWindows(df.increasing, windows, time.index, i)
    df.stat.increasing = subset(df.stat.increasing, select = -c(do.win2, do.win3))
    df.stat.constant = singleStatWindows(df.constant, windows,time.index, i)
    df.stat.constant = subset(df.stat.constant, select = -c(do.win2, do.win3))
    statsList[[i]] = df.stat.increasing
    statsList[[length(stats)+i]] = df.stat.constant
}
return(statsList)
}
statsList <- dfListing(df.increasing, df.constant, stats)</pre>
```

5. ROC Data

```
numThresholds=100
ROCdataList <- function(statsList, numThresholds, stats, windows, inequalities) {</pre>
  rocList = list()
  ineqList = rep(1:5,2)
  for(i in 1:length(statsList)) {
    temp.list = list()
    for(j in 1:length(windows)) {
      temp.list[[j]] = ROCcurveData(statsList[[i]][c(1,j+1)], numThresholds, inequalities[ineqList[i]])
    df.stat.type.roc = cbind(temp.list[[1]],
                              temp.list[[2]],
                              temp.list[[3]])
    colnames(df.stat.type.roc) = c("threshold", "TPR1", "FPR1", "threshold2", "TPR2", "FPR2", "threshold
    df.stat.type.roc = subset(df.stat.type.roc, select=-c(threshold2, threshold3))
    rocList[[i]] = df.stat.type.roc
  return(rocList)
}
roc.list <- ROCdataList(statsList, numThresholds, stats, windows, inequalities)</pre>
```

6. ROC Plots

```
library(ggplot2)
plotList <- function(roc.list) {
  roc.plot.list = list()
  for(i in 1:length(roc.list)) {
    curve.stat.type = ggplot() +
      geom_point(data=roc.list[[i]], aes(x=FPR1, y=TPR1, color="1 year")) +
      geom_point(data=roc.list[[i]], aes(x=FPR2, y=TPR2, color="2 years")) +
      geom_point(data=roc.list[[i]], aes(x=FPR3, y=TPR3, color="3 years")) +
      geom_abline(slope=1, intercept=0, linetype=3) +</pre>
```

```
theme(legend.position = "none") +
       xlab("FPR") + ylab("TPR")
    roc.plot.list[[i]] = curve.stat.type
  return(roc.plot.list)
roc.plot.list <- plotList(roc.list)</pre>
library(gridExtra)
library(ggplot2)
grid.arrange(
  roc.plot.list[[1]],
  roc.plot.list[[2]],
  roc.plot.list[[3]],
  roc.plot.list[[4]],
  roc.plot.list[[5]],
  roc.plot.list[[6]],
  roc.plot.list[[7]],
  roc.plot.list[[8]],
  roc.plot.list[[9]],
  roc.plot.list[[10]],
  ncol=2
)
             0.25
                    0.50
                            0.75
                                   1.00
                                                      0.25
                                                             0.50
                                                                    0.75
                                                                            1.00
      0.00
                                              0.00
                    FPR
             0.25
                    0.50
                            0.75
                                   1.00
                                                     0.25
                                                             0.50
                                                                    0.75
                                                                            1.00
      0.00
                                              0.00
                    FPR
                                                             FPR
             0.25
                                                      0.25
      0.00
                    0.50
                            0.75
                                   1.00
                                                             0.50
                                                                    0.75
                                                                            1.00
                                              0.00
                    FPR
                                                             FPR
             0.25
                                                      0.25
      0.00
                     0.50
                            0.75
                                   1.00
                                                             0.50
                                                                    0.75
                                                                            1.00
                                              0.00
                    FPR
                                                             FPR
                                                      0.25
             0.25
                     0.50
                            0.75
                                   1.00
                                                             0.50
                                                                    0.75
                                                                            1.00
      0.00
                                              0.00
                    FPR
                                                             FPR
```