#### **User-defined functions**

```
In[*]:= KroneckerSum[A_, B_] := Module[
       {m, n},
       m = Length[A];
       n = Length[Transpose[A]];
       KroneckerProduct[A, IdentityMatrix[m]] + KroneckerProduct[IdentityMatrix[n], B]]
In[*]:= (* Vec operator *)
    Vec[A_] := Flatten[A, {2, 1}]
l_{n[\cdot\cdot\cdot]}= (* covariances of the stationary distribution of a system of stochastic differential
      equations (continuous-time). Assumes all matrixes have dimensions m X m*)
    StatCov[A_, B_, C_] := Module[
       {m, covVec},
       m = Length[A];
       covVec = -Inverse[KroneckerSum[A, A]].Vec[B.C.Transpose[B]] // Simplify;
       Transpose[ArrayReshape[covVec, {m, m}]]]
l_{n[\cdot\cdot\cdot]}= (* covariances of the stationary distribution of a system of stochastic difference
      equations (discrete-time). Assumes all matrixes have dimensions m X m*)
    StatCovDiscrete[A_, B_, C_] := Module[
       {m, covVec},
       m = Length[A];
       covVec = Inverse[IdentityMatrix[m^2] - KroneckerProduct[A, A]].
          Vec[B.C.Transpose[B]] // Simplify;
       Transpose[ArrayReshape[covVec, {m, m}]]]
```

#### EC Covariance for a resident species

```
\label{eq:local_state} \begin{cases} \text{In}_{f^*} := & \text{(* define the drift and diffusion matrixes *)} \\ A = & \{\{F_{"N"}, F_{"E"}\}, \{0, G_{"E"}\}\}; \\ B = & \{\{0, 0\}, \{0, \sigma\}\}; \\ \text{WCor} = & \{\{1, 0\}, \{0, 1\}\}; \text{(* wCor is C in the main text, but C is a protected symbol in Mathematica *)} \\ \text{In}_{f^*} := & \text{(* the covariances of the stationary distribution *)} \\ \text{statCov} = & \text{StatCov}[A, B, \text{WCor}]; \\ \text{statCov} / & \text{MatrixForm} / / & \text{Simplify} \\ \text{Out}_{f^*} := & \text{(* Tationships between ordinary model parameters and the time-scale parameters *)} \\ \text{In}_{f^*} := & \text{(* relationships between ordinary model parameters and the time-scale parameters *)} \\ \text{subs} = & \text{G}_{"E"} \rightarrow -\frac{1}{T_{"E"}}, \tilde{C}_{"N"} \rightarrow \frac{1}{F_{"E"}}, \tilde{T}_{"E \rightarrow C"} \\ \end{cases};
```

```
In[⊕]:= (* express Cov(E,C) in terms of the timescale parameters *)
      covEC = \tilde{C}_{"N"} statCov[[1, 2]] /. subs // FullSimplify
\textit{Out[ *]= } \frac{\sigma^2 \ T_E^2}{2 \ T_{E \rightarrow C} - 2 \ F_N \ T_E \ T_{E \rightarrow C}}
ln[-p]= (* shows that Cov(E,C) increases with T_{-E} and decreases with T_{-E}. The
       reduce function takes a sequence of assumptions (separated by "&&")
       and reduces them in number. The fact that the additional assumption
        (i.e., that the derivative of covEC with respect to T_{E} is positive) does not
       show up in the output of reduce means that this is a redundant assumption -- it
        could be derived from the constraints on the elements of the A and B matrixes,
      which are captured in the variable named "$Assumptions" *)
      $Assumptions = \sigma > 0 \&\& F_{"N"} < 0 \&\& T_{"E"} > 0 \&\& T_{"E \to C"} > 0;
      Reduce[$Assumptions &&D[covEC, T_{E'}] > 0]
      Reduce[$Assumptions && D[covEC, T_{"E\rightarrow C"}] < 0]
Out[*]= F_N < 0 \&\& T_E > 0 \&\& T_{E \to C} > 0 \&\& \sigma > 0
Out[*]= F_N < 0 \&\& T_E > 0 \&\& T_{E \to C} > 0 \&\& \sigma > 0
```

#### EC Covariance for an invader

```
In[*]:= (* define the drift and diffusion matrixes *)
                                              A = \left\{ \left\{ "F_{N_r}^{(r)} ", "F_{E_r}^{(r)} ", 0 \right\},\right.
                                                                       \{0, "G_{E_n}^{(r)} ", 0\},
                                                                       \{0, 0, "G_{E_i}^{(i)}"\}\};
                                              B = \{\{0, 0, 0\},\
                                                                       \{0, \sigma_r, 0\},\
                                                                       \{0, 0, \sigma_i\}\};
                                              WCor = \{\{1, 0, 0\},\}
                                                                       \{0, 1, \rho\},\
                                                                       \{0, \rho, 1\}\}; (* wCor is C in the main text,
                                               but C is a protected symbol in Mathematica *)
              In[*]:= statCov = StatCov[A, B, WCor];
                                              statCov // MatrixForm
Out[ • ]//MatrixForm=
                                                                   \frac{F_{E_{r}}^{(r)} \circ \sigma_{r}^{2}}{2 F_{N_{r}}^{(r)} \circ G_{E_{r}}^{(r)} + 2 F_{N_{r}}^{(r)} \circ G_{E_{r}}^{(r)} \circ 2} - \frac{F_{E_{r}}^{(r)} \circ \sigma_{r}^{2}}{2 F_{N_{r}}^{(r)} \circ G_{E_{r}}^{(r)} + 2 G_{E_{r}}^{(r)} \circ 2} - \frac{F_{E_{r}}^{(r)} \circ \sigma_{r}^{2}}{2 F_{N_{r}}^{(r)} \circ G_{E_{r}}^{(r)} + 2 G_{E_{r}}^{(r)} \circ 2} - \frac{\sigma_{r}^{2}}{2 G_{E_{r}}^{(r)}} - \frac{\sigma_{r}^{2}}{2 G_{E_{r}}^{(r)}} - \frac{\sigma_{r}^{2} \circ \sigma_{r}^{2}}{G_{E_{r}}^{(r)} \circ G_{E_{r}}^{(r)} \circ G_{E_{r}}^{(
                                                                                                                                                                                      -\frac{\frac{\rho \ \sigma_{i} \ \sigma_{r}}{\mathsf{G}_{\mathsf{E}_{i}}^{(i)} + \mathsf{G}_{\mathsf{E}_{r}}^{(r)}}{\mathsf{G}_{\mathsf{E}_{i}}^{(i)} + \mathsf{G}_{\mathsf{E}_{r}}^{(r)}}
              In[⊕]:= (* covariance between E<sub>i</sub> and C *)
                                                covEC = \tilde{C}_{"N"} statCov[[3, 1]] // Simplify
          \textit{Out[*]=} \ \frac{F_{E_r}^{(r)} \ \textit{O} \ \textit{o}_i \ \textit{O}_r \ \widetilde{C}_N}{\left(F_{N_r}^{(r)} \ + G_{E_i}^{(i)}\right) \ \left(G_{E_i}^{(i)} \ + G_{E_r}^{(r)}\right)}
```

#### Seasonality

```
In[*]:= (* notation differs slightly from the appendix,
         in that population density is n instead of N *)
         sol = DSolve [n'[t] = F_{N''}(n[t]) + F_{E''}\sigma Sin[2*Pi*t/p]],
                n[t], t][[1]] // FullSimplify
 \text{Out[s]= } \left\{ \text{n[t]} \rightarrow \text{e}^{\text{tF}_{N}} \, \text{C}_{\text{1}} - \frac{p \, \sigma \, \text{F}_{\text{E}} \, \left( 2 \, \pi \, \text{Cos} \left[ \frac{2 \, \pi \, \text{t}}{p} \right] \, + p \, \text{Sin} \left[ \frac{2 \, \pi \, \text{t}}{p} \right] \, \text{F}_{\text{N}} \right)}{4 \, \pi^{2} + p^{2} \, \text{F}_{\text{N}}^{2}} \right\} 
 ln[\bullet]:= (* asymptotic solution (t\to\infty) of population density*)
         nAsymp = n[t] /. sol /. c_1 \rightarrow 0
\label{eq:outprison} \textit{Out[*]=} \ - \frac{p \mathrel{\circlearrowleft} F_E \left( 2 \mathrel{\pi} \text{Cos} \left[ \frac{2 \mathrel{\pi} \text{t}}{p} \right] + p \mathrel{Sin} \left[ \frac{2 \mathrel{\pi} \text{t}}{p} \right] F_N \right)}{4 \mathrel{\pi}^2 + p^2 \mathrel{F_N^2}}
 In[*]:= (* COV(E,N)*)
         covEN = (1/p) Integrate [nAsymp * (\sigma Sin[2 * Pi * t/p]), {t, 0, p}] // FullSimplify
Out[*]= -\frac{p^2 \sigma^2 F_E F_N}{8 \pi^2 + 2 p^2 F_N^2}
 ln[\cdot]:= (* relationships between ordinary model parameters and the time-scale parameters *)
         subs \ = \ \Big\{ p \rightarrow T_{"E"}, \ \widetilde{C}_{"N"} \rightarrow \frac{1}{F_{"e"} \, T_{"e.c"}} \Big\};
 ln[*]:= (* express Cov(E,C) in terms of the timescale parameters *)
         covEC = \tilde{C}_{"N"} covEN /. subs // FullSimplify
\label{eq:outsign} \mbox{Outs} \  \, = \  \, - \frac{\mbox{$\sigma^2$ $F_N$ $T_E^2$}}{8 \; \pi^2 \; T_{E \to C} \; + \; 2 \; F_N^2 \; T_E^2 \; T_{E \to C}}
 \ln[e]:= (* shows that Cov(E,C) increases with T_{"E"} and decreases with T_{"E\to C"}. The
           reduce function takes a sequence of assumptions (separated by "&&")
           and reduces them in number. The fact that the additional assumption
           (i.e., that the derivative of covEC with respect to T_{E} is positive) does not
           show up in the output of reduce means that this is a redundant assumption -- it
           could be derived from the constraints on the elements of the A and B matrixes,
         which are captured in the variable named "$Assumptions" *)
         $Assumptions = \sigma > 0 \&\& F_{"N"} < 0 \&\& T_{"E"} > 0 \&\& T_{"E \to C"} > 0;
         Reduce[$Assumptions \&&D[covEC, T_{E'}] > 0]
         Reduce[$Assumptions && D[covEC, T_{E\to C}] < 0]
Out[#]= F_N < 0 && T_E > 0 && T_{E \to C} > 0 && \sigma > 0
Out[*]= F_N < 0 \&\& T_E > 0 \&\& T_{E \to C} > 0 \&\& \sigma > 0
```

```
In[*]:= (* define the drift and diffusion matrixes *)
                                      A = \{\{0, F_{E''}, F_{R''}\},\
                                                           \{0, G_{E'}, 0\},\
                                                           \{H_{"N"}, H_{"E"}, H_{"R"}\}\};
                                      B = \{\{0, 0, 0\},\
                                                           \{0, \sigma, 0\},\
                                                           \{0, 0, 0\}\};
                                      WCor = {
                                                           {1, 0, 0},
                                                           \{0, 1, 0\},\
                                                           {0, 0, 1}}; (* wCor is C in the main text,
                                      but C is a protected symbol in Mathematica *)
            | In[⊕]:= (* The covariances of the stationary distribution *)
                                        statCov = StatCov[A, B, WCor];
                                        statCov // MatrixForm
Out[ • ]//MatrixForm=
                                                 -\frac{\sigma^{2}\left(F_{R}^{2}\,H_{E}^{2}\,\left(G_{E}+H_{R}\right)+F_{E}^{2}\,H_{R}^{2}\,\left(G_{E}+H_{R}\right)-F_{E}\,F_{R}\,\left(F_{E}\,G_{E}\,H_{N}+2\,H_{E}\,H_{R}\,\left(G_{E}+H_{R}\right)\right)\right)}{2\,F_{R}\,G_{E}\,H_{N}\,H_{R}\,\left(-G_{E}^{2}+F_{R}\,H_{N}-G_{E}\,H_{R}\right)} \\ -\frac{\sigma^{2}\left(-F_{R}\,H_{E}+F_{E}\,\left(G_{E}+H_{R}\right)\right)}{2\,G_{E}\left(G_{E}^{2}-F_{R}\,H_{N}+G_{E}\,H_{R}\right)} \\ -\frac{\sigma^{2}\left(-F_{R}\,H_{E}+F_{E}\,\left(G_{E}+H_{R}\right)\right)}{2\,F_{R}\,G_{E}\left(-G_{E}^{2}+F_{R}\,H_{N}-G_{E}\,H_{R}\right)} \\ -\frac{\sigma^{2}\left(-F_{R}\,H_{E}+F_{E}\,\left(G_{E}+H_{R}\right)\right)}{2\,F_{R}\,G_{E}\left(-G_{E}^{2}+F_{R}\,H_{N}-G_{E}\,H_{R}\right)} \\ -\frac{\sigma^{2}\left(-F_{R}\,H_{E}+F_{E}\,\left(G_{E}+H_{R}\right)\right)}{2\,F_{R}\,G_{E}\left(-G_{E}^{2}+F_{R}\,H_{N}-G_{E}\,H_{R}\right)} \\ -\frac{\sigma^{2}\left(-F_{R}\,H_{E}+F_{E}\,\left(G_{E}+H_{R}\right)\right)}{2\,F_{R}\,G_{E}\,G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+G_{E}^{2}+
                                                                                                                          \frac{\bigcirc^{2} \ \left(-F_{R} \ H_{E} + F_{E} \ \left(G_{E} + H_{R}\right)\ \right)}{2 \ G_{E} \ \left(G_{E}^{2} - F_{R} \ H_{N} + G_{E} \ H_{R}\right)}
                                                                                                                                                                                                                                                                                                                      \begin{split} & -\frac{\sigma^2}{2\,G_E} & \frac{\sigma^2\,\left(G_E\,H_E\!-\!F_E\,H_N\right)}{2\,G_E\,\left(G_E^2\!-\!F_R\,H_N\!+\!G_E\,H_R\right)} \\ & \frac{\sigma^2\,\left(G_E\,H_E\!-\!F_E\,H_N\right)}{2\,G_E\,\left(G_E^2\!-\!F_R\,H_N\!+\!G_E\,H_R\right)} & \frac{\sigma^2\,\left(F_R\,G_E\,H_E^2\!-\!F_E^2\,H_N\,\left(G_E\!+\!H_R\right)\right)}{2\,F_R\,G_E\,H_R\,\left(-G_E^2\!+\!F_R\,H_N\!-\!G_E\,H_R\right)} \end{split}
            In[@]:= (* the eigenvalues of the matrix A *)
                                        eA = Eigenvalues[A]
        Out[*]= \left\{G_{E}, \frac{1}{2} \left(H_{R} - \sqrt{4 F_{R} H_{N} + H_{R}^{2}}\right), \frac{1}{2} \left(H_{R} + \sqrt{4 F_{R} H_{N} + H_{R}^{2}}\right)\right\}
            <code>ln[•]:= (* Define known constraints on the model parameters *)</code>
                                       $Assumptions =
                                                    \sigma > 0 \,\&\&\, F_{"R"} > 0 \,\&\&\, F_{"E"} > 0 \,\&\&\, H_{"N"} < 0 \,\&\&\, H_{"R"} < 0 \,\&\&\, H_{"E"} \leq 0 \,\&\&\, G_{"E"} < 0 \,\&\&\, \tilde{C}_{"N"} < 0;
                                         (* Here, we learn what additional constraints are needed in order for the
                                              deterministic system to be stable, which is equivalent to all eigenvalues < 0 *)
                                        $Assumptions = Reduce[$Assumptions && And @@ Map[# < 0 &, eA]]
                                         (* note the derived constraint: -\frac{H^2_{\pi_R^{"'}}}{4~F^{"}_{\pi_R^{"'}}} \le H_{"N"} < 0~*)
        \textit{Out[*]} = \; G_E \; < \; 0 \; \&\& \; \widetilde{C}_N \; < \; 0 \; \&\& \; \sigma \; > \; 0 \; \&\& \; F_E \; > \; 0 \; \&\& \; F_R \; > \; 0 \; \&\& \; H_R \; < \; 0 \; \&\& \; - \; \frac{H_R^2}{4 \; F_n} \; \leq \; H_N \; < \; 0 \; \&\& \; H_E \; \leq \; 0 \; \&\& \; H_R \; < \; 0 \; \&\& \; H_R \; 
            In[*]:= (* Cov(E,C) *)
                                       covEC = \tilde{C}_{"N"} statCov[[2, 3]] // Simplify
```

$$ln[*]:= (* Cov(E,C)*)$$
  
 $covEC = \tilde{C}_{"N"} statCov[[2, 3]] // Simplify$ 

$$\label{eq:outsym} _{Outs \# F} = \; \frac{{{{\mathcal O}^2}\left( {{G_E}\,{H_E} - {F_E}\,{H_N}} \right)\,\,{{\widetilde C}_N}}}{{2\,{G_E}\left( {G_E^2 - {F_R}\,{H_N} + {G_E}\,{H_R}} \right)}}$$

 $_{ln[*]:=}$  (\* relationships between ordinary model parameters and the time-scale parameters \*)

$$subs \ = \ \Big\{ G_{^{"}E^{"}} \to - \frac{1}{T_{^{"}E^{"}}}, \ \widetilde{C}_{^{"}N^{"}} \to \frac{1}{H_{^{"}N^{"}} \, F_{^{"}E^{"}} \, T_{^{"}E \to C^{"}}} \Big\};$$

 $m_{\ell^*\ell^*}=$  (\* Cov(E,C), reparameterized. Note that the expression still contains  $H_{"N"}$ , which is a constituent of  $T_{E\to C}$ \*) covECv2 = covEC /. subs // Simplify

$${\it Out[*]$=} \ \, - \frac{\sigma^2 \; T_E^2 \; \left( \, H_E \, + \, F_E \; H_N \; T_E \, \right)}{2 \; F_E \; H_N \; \left( - \, 1 \, + \, H_R \; T_E \, + \, F_R \; H_N \; T_E^2 \right) \; T_{E \to C}}$$

(\* Here we show that Cov(E,C) increases with  $T_{E-C}$  and decreases with  $T_{E-C}$ . We do not take the derivative of covEC with respect to the time-scale parameters, since the constituents of  $T_{"E\to C"}$  cannot be fully eliminated from the expression for cov(E,C) (see covECv2) . Put another way taking the derivative of covECv2 with respect to  $T_{E\to C}$  is like asking what happens to covECv2 when  $T_{E\to C}$ increases but all other parameters stay the same; but this is nonsensical, because  $T_{"E\to C"}$  increasing can be caused by  $H_{"N"}$  decreasing. Instead, we look at the relationship between covEC and the constituents of  $T_{"E"}$  and  $T_{"E \to C"}$ :  $\tilde{C}_{"N"}$ ,  $H_{"N"}$ ,  $F_{"E"}$ ,  $H_{"E"}$ . As explained in the text of the appendix, when  $H_{"E"}=0$ , we expect that covEC is a decreasing function of  $C_{"R"}$  and  $H_{"N"}$ ; and that covEC is an increasing function of F $_{^{
m F}^{
m r}}$  adn G $_{^{
m r}}{}^{
m r}$ . This turns out to be true.  $\star$ )

In[\*]:= Reduce [\$Assumptions &&  $H_{"E"}=0$  && D[covEC,  $\tilde{C}_{"N"}$ ] < 0] Reduce[\$Assumptions &&  $H_{E''} = 0 \& D[covEC, H_{N''}] < 0$ ] Reduce[\$Assumptions &&  $H_{E''} = 0 \& D[covEC, F_{E''}] > 0$ ] Reduce[\$Assumptions &&  $H_{E''} = 0 \& D[covEC, G_{E''}] > 0$ ]

$$\text{Out}[*] = \ \widetilde{C}_N < 0 \, \&\& \, F_R > 0 \, \&\& \, H_R < 0 \, \&\& \, -\frac{H_R^2}{4 \, F_R} \, \leq \, H_N < 0 \, \&\& \, F_E > 0 \, \&\& \, G_E < 0 \, \&\& \, \sigma > 0 \, \&\& \, H_E == 0 \, \&\& \, G_E < 0$$

$$\textit{Out[=]=} \quad F_R > 0 \; \&\& \; H_R \; < \; 0 \; \&\& \; - \; \frac{H_R^2}{4 \; F_R} \; \leq \; H_N \; < \; 0 \; \&\& \; F_E \; > \; 0 \; \&\& \; G_E \; < \; 0 \; \&\& \; \widetilde{C}_N \; < \; 0 \; \&\& \; \sigma \; > \; 0 \; \&\& \; H_E \; = \; 0 \; \&\& \; G_E \; < \; 0$$

$$\text{Out[s]} = \text{F}_{E} > \text{0 \&\& H}_{E} = \text{0 \&\& F}_{R} > \text{0 \&\& H}_{R} < \text{0 \&\& -} \\ \frac{H_{R}^{2}}{4 \text{ F}_{R}} \leq H_{N} < \text{0 \&\& G}_{E} < \text{0 \&\& $\widetilde{C}_{N}$} < \text{0 \&\& $\sigma$} > \text{0 \&\& $\sigma$}$$

$$\textit{Out[=]} = F_R > 0 \&\& H_R < 0 \&\& -\frac{H_R^2}{4 \; F_R} \leq H_N < 0 \&\& \; F_E > 0 \&\& \; G_E < 0 \&\& \; \widetilde{C}_N < 0 \&\& \; \sigma > 0 \&\& \; H_E == 0 \&\& \; G_R < 0 \&\&$$

```
ln[\cdot]:= (* As explained in the text of the appendix, when H_{"E"}< 0,
         we expect that covEC is a decreasing function of C_{"R"} and H_{"E"};
         and that covEC is an increasing function of G"E". This turns out to be true. *)
         Reduce [$Assumptions && H_{E''} < 0 & D[covEC, \tilde{C}_{N''}] < 0]
         Reduce[$Assumptions \&\& H_{"E"} < 0 \&\& D[covEC, H_{"E"}] < 0]
         Reduce[$Assumptions \& H_{"E"} < 0 \& D[covEC, G_{"E"}] > 0]
 \text{Out}[*] = \ \widetilde{C}_N < 0 \, \&\& \, F_R > 0 \, \&\& \, H_R < 0 \, \&\& \, -\frac{H_R^2}{4 \, F_R} \\ \le H_N < 0 \, \&\& \, F_E > 0 \, \&\& \, G_E < 0 \, \&\& \, H_E < 0 \, \&\& \, \sigma > 0 
\text{Out}[*] = F_E > 0 \&\& H_E < 0 \&\& F_R > 0 \&\& H_R < 0 \&\& -\frac{H_R^2}{4 F_R} \le H_N < 0 \&\& G_E < 0 \&\& \widetilde{C}_N < 0 \&\& \sigma > 0
\text{Out[*]} = F_R > 0 \&\& H_R < 0 \&\& -\frac{H_R^2}{4 F_R} \le H_N < 0 \&\& F_E > 0 \&\& G_E < 0 \&\& H_E < 0 \&\& \widetilde{C}_N < 0 \&\& \circlearrowleft > 0
```

### EC Covariance for a resident species; Discrete time

```
In[*]:= (* define the drift and diffusion matrixes *)
     A = \{\{F_{"N"}, F_{"E"}\}, \{0, G_{"E"}\}\};
     B = \{\{0, 0\}, \{0, \sigma\}\};
     WCor = \{\{1, 0\}, \{0, 1\}\}; (* wCor is C in the main text,
     but C is a protected symbol in Mathematica *)
| In[⊕]:= (* the covariances of the stationary distribution *)
     statCov = StatCovDiscrete[A, B, WCor];
     statCov // MatrixForm // Simplify
     In[*]:= (* Cov(E,C)*)
     covEC = \tilde{C}_{"N"} statCov[[1, 2]] // Simplify
```

## Phytoplankton model

```
[n[*]:= (* Dynamical equations. Note "n" and "e" are the
      population density and the environmental parameter respectively
      ("N" "E" are protected symbols in Mathematica). Similarly, "d" is the dilution rate *)
     dndt := n (c Exp[e] R - \delta)
    dRdt := \delta (S - R) - Exp[e] R n
     dedt := -\theta (e - \mu) (* deterministic skeleton of the environmental parameter's dynamics *)
```

$$\label{eq:local_$$

<code>ln[\*]:= (\* Here, we learn what additional constraints are needed in</code> order for the deterministic system to have a positive equilbirium \*) \$Assumptions =  $\sigma > 0 \& n > 0 \& R > 0 \& c > 0 \& S > 0 \& \delta > 0 \& \mu \in Reals \& \theta > 0;$ (\* the last constraint is the requirement for the phytoplankton species to have a positive per capita growth rate with resources are abundant \*) Assumptions = Reduce[Assumptions & (n /. eq) > 0 & (R /. eq) > 0](\* note the learned constraint  $\mu > \text{Log}\left[\frac{K \delta + S \delta}{c S}\right]$  \*)

 $\textit{Out[*]} = \sigma > 0 \&\& n > 0 \&\& R > 0 \&\& \Theta > 0 \&\& C > 0 \&\& S > 0 \&\& \delta > 0 \&\& \mu > - Log\left[\frac{c S}{s}\right]$ 

ln[\*]:= (\* define the drift and diffusion matrixes \*) A = D[{dndt, dedt, dRdt}, {{n, e, R}}] /. eq;  $B = \{\{0, 0, 0\}, \{0, \sigma, 0\}, \{0, 0, 0\}\};$ but C is a protected symbol in Mathematica \*) A // FullSimplify // MatrixForm

Out[ • ]//MatrixForm=

$$\left( \begin{array}{cccc} \textbf{0} & \delta & \left( \textbf{c} \; \textbf{S} - \textbf{e}^{-\mu} \; \delta \right) & \textbf{c} \; \left( \textbf{c} \; \textbf{e}^{\mu} \; \textbf{S} - \delta \right) \\ \textbf{0} & -\theta & \textbf{0} \\ -\frac{\delta}{\textbf{c}} & \delta \left( -\textbf{S} + \frac{\textbf{e}^{-\mu} \, \delta}{\textbf{c}} \right) & -\textbf{c} \; \textbf{e}^{\mu} \; \textbf{S} \end{array} \right)$$

ln[\*]:= (\* covariances of the stationary distribution \*) statCov = StatCov[A, B, WCor]; statCov // MatrixForm // Simplify

$$\begin{pmatrix} \frac{e^{-2\,\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}{2\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\,\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}{2\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\, & -\frac{e^{-2\,\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\,\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}{2\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\, & -\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}\\ -\frac{e^{-2\,\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\, & -\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\,\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}\\ -\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta}\, & -\frac{e^{-\mu} \left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta^2\,\sigma^2}{2\,c\,\theta\,\left(c\,e^{\mu}\,S\!-\!\delta\right)\,\delta} \end{pmatrix}$$

In[@]:= (\* define the competition parameter \*) comp = Log[1/(cR)]; $\tilde{C}_{"R"} = D[comp, R] /. eq // Simplify$ 

Out[\*]= 
$$-\frac{\mathbf{C} \, \mathbb{C}^{\mu}}{\delta}$$

$$ln[*]:= (* Cov(E,C)*)$$
  
 $covEC = \tilde{C}_{"R"} statCov[[2, 3]] // Simplify$ 

$$Out[\circ] = \frac{\left(c e^{\mu} S - \delta\right) \sigma^{2}}{2 \theta \left(c e^{\mu} S - \delta + \theta\right)}$$

$$ln[*]:= (*T_{E\to C}"*)$$

$$1/(\tilde{C}_{R"}*A[[3,2]]) /. eq // FullSimplify$$

$$Out[*]:= \frac{1}{C e^{\mu} S - \delta}$$

# Lottery Model (TBD)