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*Supplement of*

## **Assessing vegetation structure and ANPP dynamics in a grassland-shrubland Chihuahuan ecotone using NDVI-rainfall relationships**

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1 In this document we provide the Maple 9.5 (Maplesoft, Waterloo, Canada) codes used in the  
 2 paper (Code 1) to simulate dryland biomass dynamics for an herbaceous and a shrub species,  
 3 and (Code 2) to decompose single time series of NDVI into partial components for  
 4 herbaceous and shrub vegetation applying the reference vegetation-type characteristic  
 5 antecedent rainfall series for herbs and shrubs ( $ARain_{hv}$  and  $ARain_s$ , respectively). We also  
 6 provide a supplementary figure (Supplementary Fig. 1) that presents detailed NDVI-  
 7 antecedent rainfall correlograms obtained for each growing cycle of vegetation growth (April-  
 8 March) in the reference Black grama and Creosotebush SEV LTER Core Sites.

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1 **Code 1: Dynamic Vegetation Model**

2

3 **Input files** (location: C:\DataFolder\):

4 1. Daily rainfall: Rain.txt

5 Data is stored in columns 1 and 2 for dates and rainfall, respectively.

6

7 **Output files** (location: C:\DataFolder\):

8 1. Temporal series of herbaceous and shrub biomass: Biomass.txt

9 Data is stored in columns 1, 2 and 3 for dates, herbaceous and shrub biomass, respectively.

10 2. Temporal series of herbaceous and shrub biomass graph: Biomass.png (green, herbaceous  
11 biomass; red, shrub biomass; blue, daily rainfall).

12

13 **Procedure:**

14 1. We load the Maple packages required for the subsequent calculations.

15 > with(linalg): with(plots): with(LinearAlgebra): with(Statistics): with(plottools):

16

17 2. We load the daily rainfall data file.

18 > droot := "C:\\DataFolder\\";

19 drain := ImportMatrix(cat(droot, "Rain.txt"), source = delimited, delimiter = " ", datatype  
20 = anything):

21 dates := ImportMatrix(cat(droot, "Rain.txt"), source = delimited, delimiter = "",  
22 datatype=string):

23

24 3. We define a rainfall function (*rainFunct*) made by rainfall event pulses.

25 > rainn := convert(Column(drain, 2), list):

26 revent := [NULL]; raint := 0:

27 for i to nops(rainn) do

28 prec := convert(rainn[i], float):

```

1   if prec > 0 then
2   revent := [op(revent), [i, prec]]:
3   raint := raint+prec:
4   fi:
5   od:
6   rainFunct := t→sum(revent[jjk][2]*(-Heaviside(t-revent[jjk][1])+Heaviside(t-
7 revent[jjk][1]+1)), jjk = 1 .. nops(revent)):
8   ndata := nops(rainn);
9
10  4. We define the model equations.
11  > dB := gmax*(W-W0)*B/(W+kw)-m*B;
12  dW := P*(B+ki*i0)/(B+ki)-c*gmax*(W-W0)*B/(W+kw)-rw*W;
13  dsys := subs(W = W(t), B = B(t), [dB, dW]):
14  ecdif := [diff(B(t), t) = dsys[1], diff(W(t), t) = dsys[2]]:
15
16  5. We define a time-evolution function (evolution) that calculates and stores biomass values
17  for each day, integrating the model equations with the model parameter values.
18  > evolution := proc (param)
19  local stot, Biomasst, i:
20  stot := dsolve({op(subs(P = rainFunct(t), param, ecdif)), B(0) = 50, W(0) = .2}, numeric,
21  maxfun = 0):
22  Biomasst := NULL:
23  for i to ndata do
24  Biomasst := op([Biomasst], subs(stot(i), B(t))):
25  od:
26  RETURN(Biomasst)

```

```

1     end proc:
2
3     6. We define the parameter values and call the time-evolution function.
4     > herbParam := W0 = 0.05, kw = 0.45, ki = 180, i0 = 0.2, c = 0.1, rw = 0.1, gmax = 0.32,
5     m = 0.05:
6     shrubParam := W0 = 0.05, kw = 0.45, ki = 180, i0 = 0.2, c = 0.1, rw = 0.1, gmax = 0.12, m
7     = 0.03:
8     herbBiomass := evolution({herbParam}):
9     shrubBiomass := evolution({shrubParam}):
10
11    7. We plot the time series of herbaceous and shrub biomass along with precipitation.
12    > topl := 700:
13    figherb := pointplot([seq([i, herbBiomass[i]], i = 1 .. nops([herbBiomass]))], connect =
14    true, color = green):
15    figshrub := pointplot([seq([i, shrubBiomass[i]], i = 1 .. nops([shrubBiomass]))], connect =
16    true, color = red):
17    figYears := [NULL]:
18    for iy to 16 do
19    figYears := [op(figYears), pointplot([[365*iy, 0], [365*iy, topl]], color = grey, connect =
20    true, linestyle = 3)]
21    od:
22    figPrecipt := NULL:
23    for i to ndata do if drain[i][2] > 0 then
24    figPrecipt := op([figPrecipt], pointplot([[i, topl], [i, topl-4*drain[i][2]]], connect = true,
25    color = navy, thickness = 3):
26    fi:
27    od:

```

```
1   figures:= display(figherb, figshrub, figYears, figPrecipt):
2   display(figures);
3
4   8. We export the output files.
5   fout := cat(droot, "Biomass.txt"):
6   for i to ndata do
7   FileTools[Text][WriteLine](fout, cat(dates[i][1], " ", convert(herbBiomass[i], string), " ",
8   convert(shrubBiomass[i], string))):
9   od:
10  FileTools[Text][Close](fout):
11  plotsetup(png, plotoutput = cat(droot, "Biomass.png")):
12  display(figures);
13  plotsetup(default):
14
```

1 **Code 2: NDVI Decomposition Procedure**

2

3 **Input files** (location: C:\DataFolder\):

4 1. NDVI experimental data: case.txt

5 Data is stored in column 1.

6 2. Characteristic antecedent rainfall series for herbaceous and shrub vegetation ( $ARain_{hv}$  and  
7  $ARain_s$ , respectively): totalAR.txt

8 Data is stored in columns 1 and 2 for herbaceous and shrub vegetation, respectively.

9 3. Time in days from the initial date: totalT.txt

10 Data is stored in column 1.

11

12 **Output files** (location: C:\DataFolder\):

13 1. Temporal series of herbaceous and shrub NDVI components: HScomponents.txt

14 Data is stored in columns 1 and 2 for herbaceous and shrub biomass, respectively.

15 2. Graph with the temporal series of herbaceous and shrub NDVI, along with the original total  
16 NDVI signal: HScomponents.png (black, original signal; green, herbaceous component; red,  
17 shrub component).

18

19 **Procedure:**

20 1. We load the Maple packages required for the subsequent calculations.

21 > with(ExcelTools): with(plots): with(plottools): with(LinearAlgebra): with(Statistics):

22

23 2. We define the NDVI bare soil component (0.12) and define a function, pair, to handle data  
24 lists.

25 nsoil := 0.12;

26 pair := proc (x, y)

27 [x, y]

28 end proc

1

2 2. We load the data files and store data as lists. The following data lists are defined:

3 *dataAR1* = antecedent rainfall series for herbaceous vegetation (57-day period, *ARain<sub>h<sub>v</sub></sub>*

4 series ).

5 *dataAR2* = antecedent rainfall series for shrubs (145-day period, *ARain<sub>s</sub>* series).

6 *dataT* = time (measured in days from the beginning of the series).

7 *dataNDVI* = original NDVI time series.

8 *dataNDVI0* = NDVI data list without the soil base line.

9 > droot := "C:\\ DataFolder \\":

10 dNDVI := ImportMatrix(cat(droot, "case.txt"), source = delimited, delimiter = " ",

11 datatype = anything):

12 totalAR := ImportMatrix(cat(droot, "TotalAR.txt"), source = delimited, delimiter = " ",

13 datatype = anything):

14 totalT := ImportMatrix(cat(droot, "totalT.txt"), source = delimited, delimiter = " "):

15 Ndata := op(rtable\_dims(dNDVI)[1])[2]:

16 dataAR1 := [NULL]: dataAR2 := [NULL]: dataAR1N := [NULL]: dataAR2N := [NULL]:

17 dataT := [NULL]: dataNDVI := [NULL]: dataNDVI0 := [NULL]:

18 for i to Ndata do

19 dataAR1 := [op(dataAR1), evalf(totalAR[i][1])]; dataAR2 := [op(dataAR2),

20 evalf(totalAR[i][2])]; dataT := [op(dataT), evalf(totalT[i][1])]; dataNDVI :=

21 [op(dataNDVI), evalf(dNDVI[i][1])]; dataNDVI0 := [op(dataNDVI0), evalf(dNDVI[i][1]-

22 nsoil)]

23 od:

24

25 4. We define a first-order least-squares optimization function (*linearfit*) that fits the partial

26 contribution of the herbaceous and shrub components to the time series of NDVI (filtered for

27 the base-line bare soil contribution, *dataNDVI0*) as a function of the vegetation-type specific

1 *antecedent rainfall series that maximize the NDVI-precipitation relationships for herbaceous*  
 2 *vegetation (dataAR1, ARain<sub>nv</sub> series) and for shrubs (dataAR2, ARain<sub>s</sub> series).*

```
3 >linearfit := proc (TAR1, TAR2, Tiemp, NDVIst)
4 local AInput, DOutput, fitlinear, dparam, i, sumres;
5 global Total;
6 AInput := zip(pair, TAR1, TAR2); DOutput := NDVIst;
7 fitlinear := LinearFit([ar1, ar2], AInput, DOutput, [ar1, ar2], output = solutionmodule);
8 dparam := fitlinear:-Results("leastsquaresfunction"); sumres := fitlinear:-
9 Results("residualsumofsquares");
10 Total := [NULL]; for i to Ndata do Total := [op(Total), subs(ar1 = AInput[i][1], ar2 =
11 AInput[i][2], dparam+nsoil)] od;
12 RETURN(dparam, sumres):
13 end proc;
```

14

15 *5. We define a function that reassigns the predicted weights of the fitted vegetation*  
 16 *components (i.e. the percentage contribution of each vegetation type over the predicted totals*  
 17 *for any t<sub>i</sub>) to match the original shape of the NDVI time series, obtaining the final NDVI*  
 18 *components for herbaceous vegetation and shrubs.*

```
19 > linDecomp := proc (TAR1, TAR2, NDVIst, fit)
20 local Ntotal, j, i, pre1, pre2, ratio;
21 global Nherb, Nshrub;
22 Nherb := [NULL]; Nshrub := [NULL]; Ntotal := [NULL];
23 for i to Ndata do
24 pre1 := subs(ar1 = TAR1[i], ar2 = 0, fit); pre2 := subs(ar1 = 0, ar2 = TAR2[i], fit);
25 if 0 <= pre1 and 0 <= pre2 then ratio := NDVIst[i]/subs(ar1 = TAR1[i], ar2 = TAR2[i], fit);
26 Ngrass := [op(Nherb), pre1*ratio]; Nshrub := [op(Nshrub), pre2*ratio] elif pre1 < 0 and 0
27 <= pre2 then Nherb := [op(Nherb), 0]; Nshrub := [op(Nshrub), NDVIst[i]] elif pre2 < 0
28 and 0 <= pre1 then Nherb := [op(Nherb), NDVIst[i]]; Nshrub := [op([Nshrub]), 0] else
29 print(errors); ratio := 1; Nherb := [op(Nherb), 0]; Nshrub := [op(Nshrub), 0] fi;
30 Ntotal := [op(Ntotal), Nherb[nops(Nherb)]+Nshrub[nops(Nshrub)]+nsoil] od;
31 RETURN(Nherb, Nshrub, Ntotal):
32 end proc;
```

1

2 6. We call the fitting and reassigning functions.

3 lfit1 := linearfit(dataAR1, dataAR2, dataT, dataNDVI0);

4 HerbShrubLineal := linDecomp(dataAR1, dataAR2, dataNDVI0, lfit1[1]):

5

6 7. We plot the time series of the NDVI signal (*figOr*), and the final NDVI components for  
7 herbaceous vegetation (*figHerb*) and shrubs (*figShrub*).

8 figOr := PLOT(CURVES(convert(sort(zip(pair, dataT, dataNDVI)), list))):

9 figHerb := PLOT(CURVES(sort(sort(zip(pair, dataT, Nherb)))), COLOR(RGB, 0, 1, 0)):

10 figShrub := PLOT(CURVES(sort(sort(zip(pair, dataT, Nshrub)))), COLOR(RGB, 1, 0, 0)):

11 display(figOr, figHerb, figShrub);

12

13 8. We export the output files.

14 fout := cat(droot, "HScomponents.txt"):

15 for i to Ndata do

16 FileTools[Text][WriteLine](fout, cat(convert(Nherb[i], string), " ", convert(Nshrub[i],  
17 string))):

18 od:

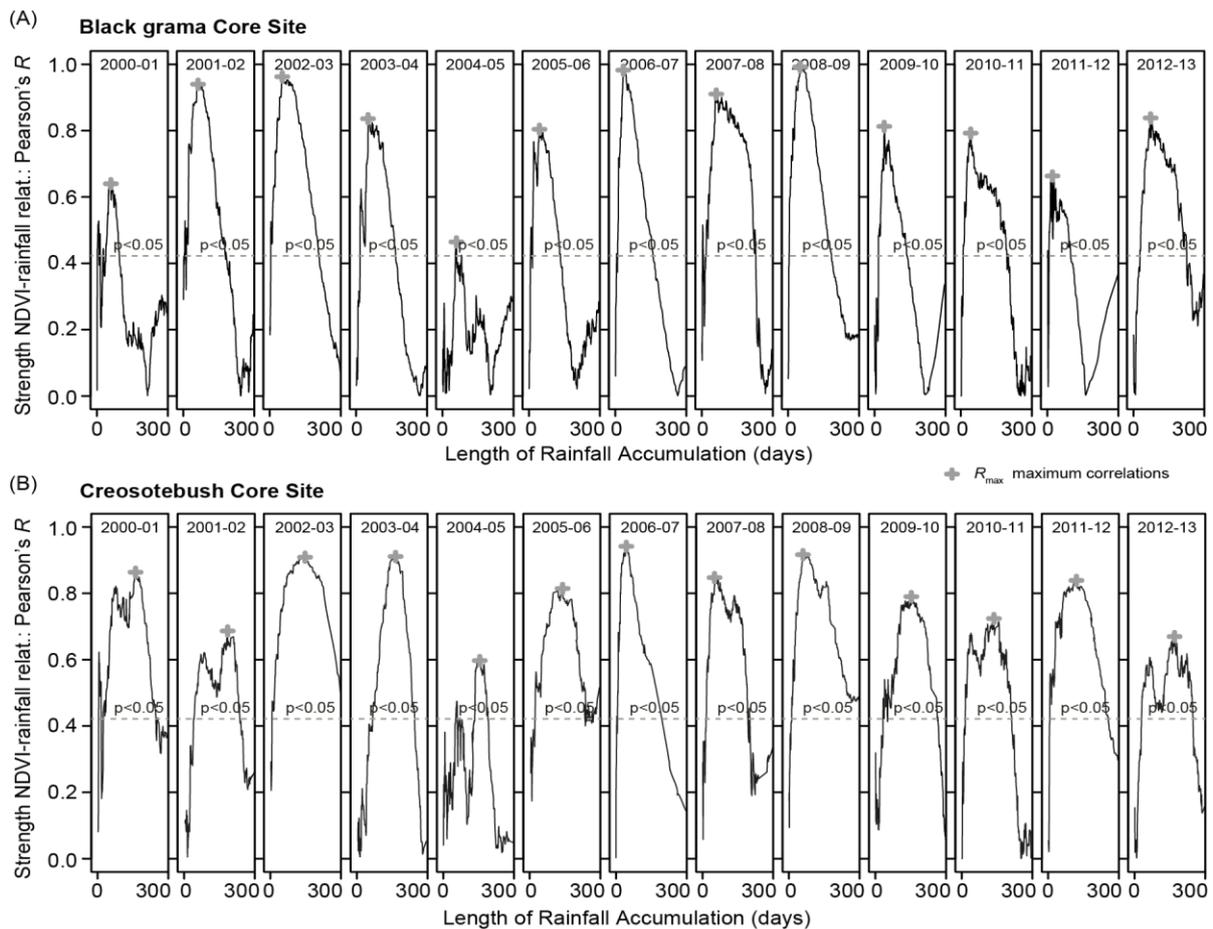
19 FileTools[Text][Close](fout):

20 plotsetup(png, plotoutput = cat(droot, "HScomponents.png")):

21 display(figOr, figHerb, figShrub):

22 plotsetup(default):

23



1  
2 **Supplementary Fig. 1.** Per annual growing cycle (April-March) NDVI-antecedent rainfall  
3 correlograms for the (A) Black grama and (B) Creosotebush SEV LTER Core Sites.  
4 **Notes:**  
5 Correlations between NDVI and antecedent precipitation are maximized using a rainfall  
6 accumulation length of about 57 days for all annual cycles of vegetation growth in the Black  
7 grama Core Site (Supplementary Fig. 1A).  
8 For the Creosotebush Core Site two different foci that maximize the correlation between  
9 NDVI and antecedent rainfall can be detected: (i) one using a low rainfall accumulation  
10 length (about 57 days) and (ii) another using a long rainfall accumulation length (about 145  
11 days). The 145 days antecedent rainfall series generally shows a stronger correlation with the  
12 NDVI than the 57 days antecedent rainfall series (cycles 2000-01, 2001-02, 2002-03, 2003-  
13 04, 2004-05, 2009-10, 2010-11, 2011-12, 2012-13). However, for three consecutive annual  
14 cycles with strong summer precipitation (2006-07, 2007-08, and 2008-09, summer  
15 precipitation for the period is 40% above the long-term mean) correlation of NDVI to the the  
16 57 days antecedent rainfall series is stronger than to the 145 days antecedent rainfall series  
17 (Supplementary Fig. 1B).