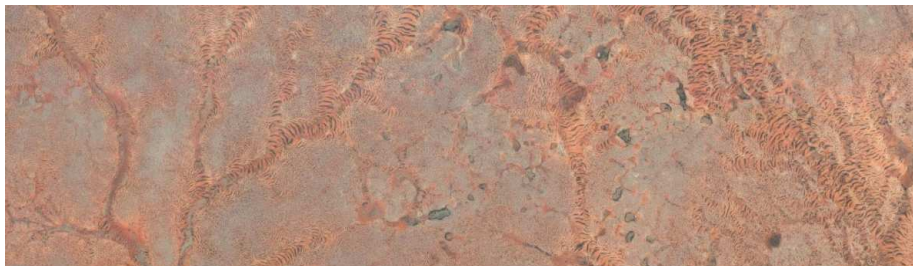


Water transport in models of dryland vegetation patterns

Punit Gandhi

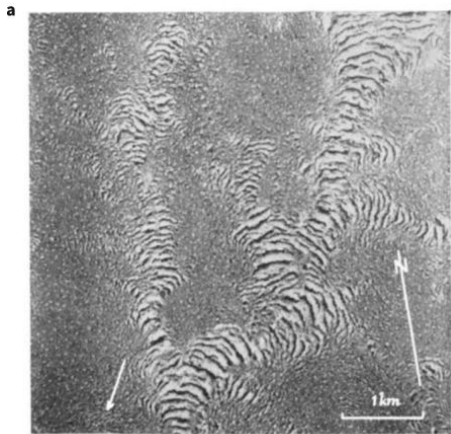
Mathematical Biosciences Institute, Ohio State University, Columbus, OH 43210

May 20, 2019



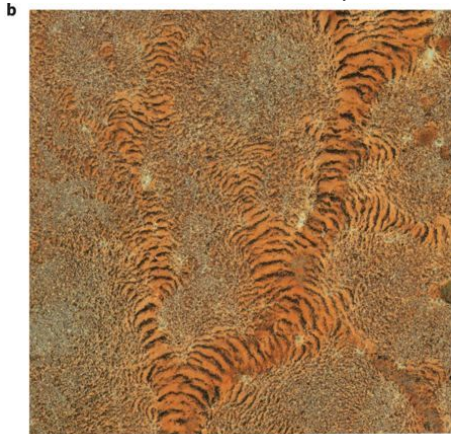
“Landscape Scale” → “Pattern Scale”

British Somaliland, 1945



Mar. 1945

Ethiopia, 2011



Dec. 2011

Macfadyen, *Geograph. J.*, **116**(4) (1950). Gowda, Iams, Silber, *Scientific Reports*, **8**(1) (2018).

“Pattern Scale” → “Plant Scale”

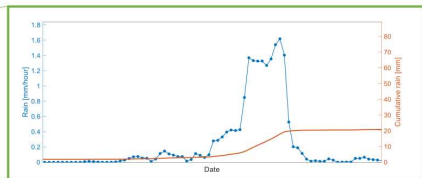
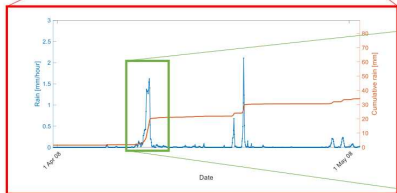
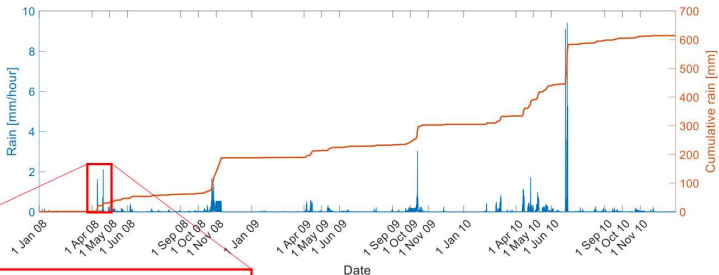
Boaler & Hodge, *Ecology J.*, 52(3) (1964).



Infrequent and unpredictable water input

Rainfall data: 2008-2010

Haud Africa
(8.00, 47.58)



Compiled by S. Bonetti

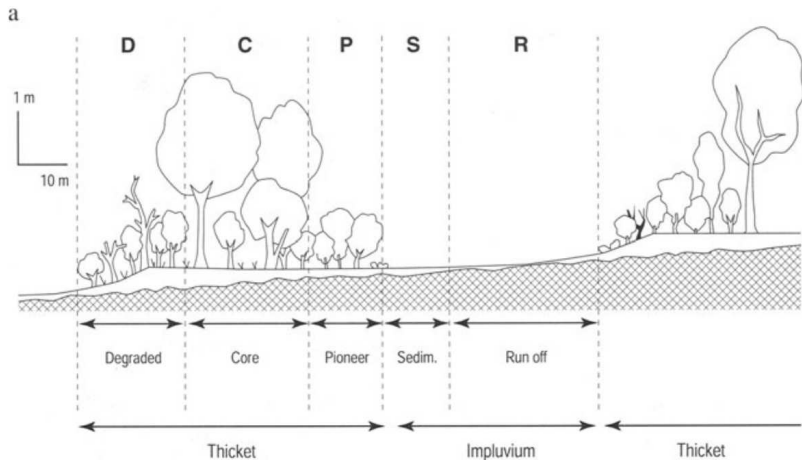


Figure 1.3a. Schematic diagram of a typical transect through the tiger bush in Niger. (Adapted from Thiéry, d'Herbès, and Valentin 1995; Hiernaux and Gérard 1999.)

J.-M. d'Herbès et al. *Banded vegetation patterning in arid and semiarid environments*. Springer, New York (2001).

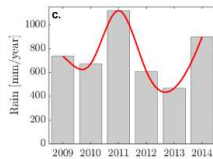
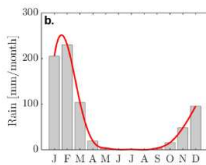
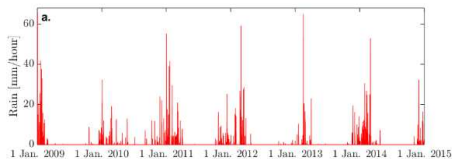
Processes: Different timescales and different locations

Timescales for water and biomass

- ▶ Minutes-Hours: rain events, surface water transport, infiltration
- ▶ Weeks-Months: evapotranspiration, plant growth and death
- ▶ Years-Decades: vegetation colonization

Locations for hydrological processes

- ▶ Surface: rain, transport, -infiltration
- ▶ Soil: +infiltration, evapotranspiration

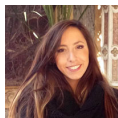


Stewart Plains, Australia: Beringer et al. *Biogeosciences* (2016).

Conceptual modeling with a focus on timescales

Goals

- ▶ Better use data to constrain model parameters.
- ▶ Build a modeling framework that can incorporate stochasticity from infrequent and largely unpredictable water input.
- ▶ Keep the model simple enough for analysis (or at least simple enough for numerical simulations)



Sara Bonetti
(ETH Zurich)



Amilcare Porporato
(Princeton)



Sarah Iams
(Harvard)



Mary Silber
(U Chicago)

Presentation Outline

Existing modeling frameworks

Modeling processes on relevant timescales

Preliminary simulation results for a fast/slow model

A simple reaction-advection-diffusion model

Klausmeier, *Science*, **284** (1999)

Klausmeier Model

Biomass:

$$\frac{\partial B}{\partial T} = \underbrace{-MB}_{\text{mortality}} + \underbrace{JRW B^2}_{\text{growth}} + \underbrace{D\nabla^2 B}_{\text{dispersal}}$$

Water:

$$\frac{\partial W}{\partial T} = \underbrace{A}_{\text{precipitation}} - \underbrace{LW - RW B^2}_{\text{evapotranspiration}} + \underbrace{V \frac{\partial W}{\partial X}}_{\text{transport}}$$

Klausmeier's Parameters

$J=0.003$ kg Dry Mass/kg H₂O (maximum water use efficiency)

$M=1.8$ yr⁻¹ (carbon costs required to maintain leaves)

Mauchamp et al, *Ecol. Model.*, **71** (1994).

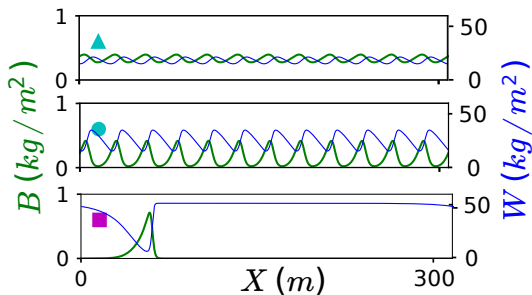
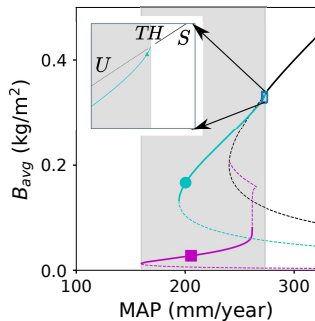
$L=4$ yr⁻¹ (observed soil water + predicted bare soil state)

$R = 100$ mm H₂O/yr/(kg Dry Mass)² (observed biomass + predicted vegetated state)

V, D Fit to match observed pattern wavelength and migration speed

Predictions about hydrology

Klausmeier Model



Water is maximum in bare soil between vegetation bands

Modeling infiltration of surface water into soil

Klausmeier “Water” → Surface water + Soil water

Rietkerk et al, *Am. Nat.* **160** (2002). See also: Gilad et al, *PRL* **93** (2004).

$$\text{Biomass : } \frac{\partial B}{\partial T} = - \underbrace{mB}_{\text{mortality}} + \underbrace{c\mathcal{G}(W)B}_{\text{growth}} + \underbrace{D_b \nabla^2 B}_{\text{seed dispersal}}$$

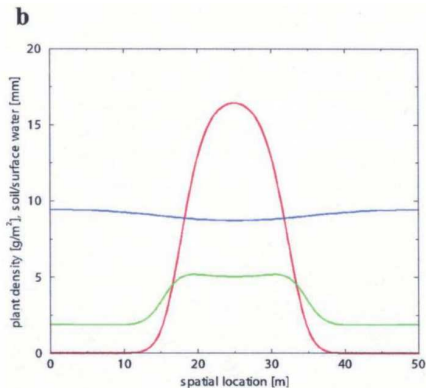
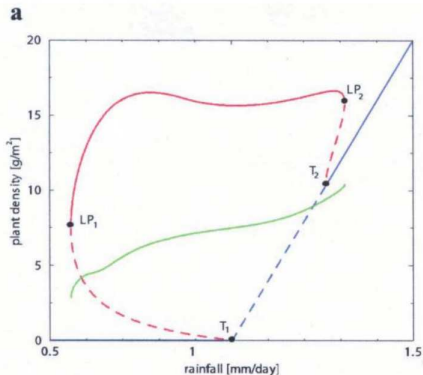
$$\text{Soil water : } \frac{\partial W}{\partial T} = \underbrace{\mathcal{I}(B)H}_{\text{infiltration}} - \underbrace{rW - \mathcal{G}(W)B}_{\text{evapotranspiration}} + \underbrace{D_w \nabla^2 W}_{\text{soil diffusion}}$$

$$\text{Surface water : } \frac{\partial H}{\partial T} = \underbrace{P}_{\text{precipitation}} - \underbrace{\mathcal{I}(B)H}_{\text{infiltration}} + \underbrace{V_h \frac{\partial H}{\partial X}}_{\text{surface transport}}$$

$$\mathcal{G}(W) = g \frac{W}{W + k}, \quad \mathcal{I} = \alpha \frac{B + qf}{B + q}.$$

Predictions about hydrology

Rietkerk Model



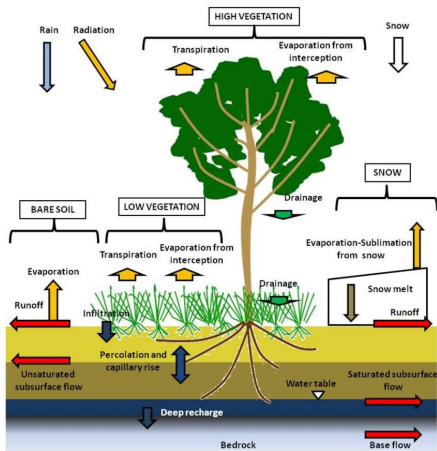
Rietkerk et al, *Am. Nat.* **160** (2002)

Soil water is maximum in vegetation band

Surface water is minimum in vegetation band

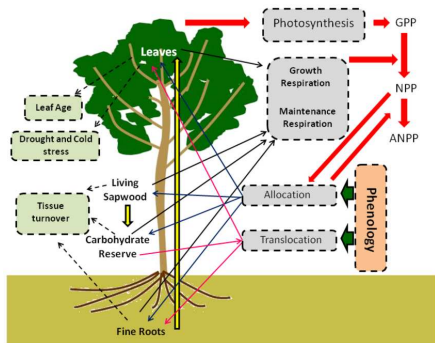
other phase possible in 3-field models: Kinast et al, *PRL* **112** (2014)

A mechanistic ecohydrological model



Hydrology and energy balance

“Tethys-Chloris” (T&C) Model



Carbon fluxes

Fatichi et al., *J. Adv. Model. Earth Syst.* 4 M05002 (2012)

A mechanistic ecohydrological model

“Tethys-Chloris” (T&C) Model

Table 2. A List of Principal Fluxes and States Simulated by “Tethys-Chloris”

Variable	Description	Units
<i>Energy and Mass Fluxes</i>		
R_{dir}	Absorbed shortwave radiation	[W m ⁻²]
R_{diff}	Absorbed longwave radiation	[W m ⁻²]
R_{net}	Absorbed Photosynthetically Active Radiation	[W m ⁻²]
R_{net}	Net radiation	[W m ⁻²]
R_{leaf}	Sensible heat	[W m ⁻²]
R_{leaf}	Latent heat	[W m ⁻²]
G_0	Ground heat flux	[W m ⁻²]
G_0	Incoming heat with precipitation	[W m ⁻²]
T_c	Prognostic soil surface temperature	[°C]
T_c	Ground temperature at clearing depth	[°C]
T_{veg}	Transpiration flux from vegetation	[mm h ⁻¹]
T_{veg}	Evaporation flux from ground under vegetation	[mm h ⁻¹]
E_{veg}	Evaporation flux from bare soil	[mm h ⁻¹]
E_{veg}	Evaporation flux from water surface	[mm h ⁻¹]
E_{veg}	Evaporation/sublimation flux from snow in open surface and snow under vegetation	[mm h ⁻¹]
E_{veg}	Evaporation flux from intercepted water in canopy	[mm h ⁻¹]
S_{veg}	Albedo of ground	[-]
S_{veg}	Albedo of snow	[-]
S_{veg}	Water albedo	[-]
α	Transmissivity of a generic surface	[-]
α	Absorptivity of a generic surface	[-]
β_{veg}	Liquid (rain) interception	[mm h ⁻¹]
β_{veg}	Solid (snow) precipitation	[mm h ⁻¹]
<i>Transfer Properties/Resistance</i>		
r_{veg}	Aerodynamic resistance	[s m ⁻¹]
r_{veg}	Undercanopy resistance	[s m ⁻¹]
r_{veg}	Leaf boundary layer resistance	[s m ⁻¹]
r_{veg}	Soil resistance	[s m ⁻¹]
r_{veg}	Stomatal resistance	[s m ⁻¹]
r_{veg}	Z0-plane displacement height	[m]
r_{veg}	Roughness length for momentum	[m]
r_{veg}	Roughness length for heat flux	[m]
r_{veg}	Roughness length for water vapor	[m]
r_{veg}	Absorptivity coefficient for undercanopy resistance	[-]
r_{veg}	Absorptivity coefficient for leaf boundary layer conductance	[-]
r_{veg}	Humidity equilibrium value for soil water content	[-]
<i>Biochemical Models of Photosynthesis</i>		
R_{veg}	Net assimilation rate	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Dark respiration	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Gross photosynthesis rate	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Canopy maximum Rubisco capacity at 25°C	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Canopy maximum electron transport capacity at 25°C	[mmol e ⁻ m ⁻² s ⁻¹]
R_{veg}	Maximum Rubisco capacity at canopy scale after accounting for temperature dependence	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Maximum electron transport capacity at canopy scale after accounting for temperature dependence	[mmol e ⁻ m ⁻² s ⁻¹]
R_{veg}	Maximum diurnal maximum Rubisco capacity at 25°C at leaf scale	[mmol CO ₂ m ⁻² s ⁻¹]
R_{veg}	Partial pressure of intercellular CO ₂	[Pa]
<i>Stem Hydrology</i>		
R_{veg}	Budbreak operator reflecting presence or absence of snow	[W]
R_{veg}	Snow water equivalent of ground snowpack	[mm]
R_{veg}	Snow water equivalent of intercepted snow in high-vegetation layer	[mm]
R_{veg}	Net energy flux input to snowpack	[W m ⁻²]
R_{veg}	Snowmelt rate	[mm h ⁻¹]
R_{veg}	Heat release from melting (negative) or freezing (positive) of liquid water content held by snow	[W m ⁻²]
R_{veg}	Sublimation of intercepted snow	[mm]
R_{veg}	Intercepted fresh snow	[mm h ⁻¹]
R_{veg}	Sublimation/evaporation from intercepted snow	[mm h ⁻¹]
R_{veg}	Fraction of canopy covered by snow	[-]
R_{veg}	Water released from snowpack	[mm]
R_{veg}	Water content in snowpack	[mm]
R_{veg}	Snow depth	[mm]
R_{veg}	Density of fresh snow	[kg m ⁻³]
R_{veg}	Snow density of ground snowpack	[kg m ⁻³]
R_{veg}	Maximum water holding capacity of snowpack	[mm]

Table 2. Continued

Variable	Description	Units
C_{veg}	Capacity of PFT area occupied by leaves and stems projected in vertical direction	[m ² against area/m ²]
C_{veg}	Intercepted water stored in canopy	[mm]
C_{veg}	Total drainage from a vegetation layer	[mm h ⁻¹]
C_{veg}	Rate of dripping from canopy	[mm h ⁻¹]
C_{veg}	Canopy drainage at substrate	[mm h ⁻¹]
<i>Subsurface Water Dynamics</i>		
C_{veg}	Total rate of inflow of water to soil surface	[mm h ⁻¹]
C_{veg}	Runes flux rate	[mm h ⁻¹]
C_{veg}	Infiltration capacity ratio	[mm h ⁻¹]
C_{veg}	Actual infiltration rate	[mm h ⁻¹]
C_{veg}	Rate of infiltration excess runoff	[mm h ⁻¹]
C_{veg}	Rate of saturation excess runoff	[mm h ⁻¹]
C_{veg}	Infiltrating subsurface lateral flux rate	[mm h ⁻¹]
C_{veg}	Outgoing subsurface lateral flux rate	[mm h ⁻¹]
C_{veg}	Leakage between vadose zone and bedrock, recharge to deep aquifers	[mm h ⁻¹]
C_{veg}	Bulk density of soil	[kg m ⁻³]
C_{veg}	Rainfall convective kinetic energy	[J mm ⁻¹]
C_{veg}	Volcanic and water content	[-]
C_{veg}	Soil water potential	[mm or (MPa)]
C_{veg}	Unsaturation hydraulic conductivity	[mm h ⁻¹]
C_{veg}	Water table depth	[mm]
<i>Surface Water Dynamics</i>		
C_{veg}	Overland runoff depth	[mm]
C_{veg}	Channel runoff depth	[mm]
C_{veg}	Overland flow depth	[mm]
C_{veg}	Channel flow depth	[mm]
C_{veg}	Overland flow velocity	[m s ⁻¹]
C_{veg}	Channel flow velocity	[m s ⁻¹]
C_{veg}	Rozal fraction of R_{veg}	[mm]
C_{veg}	Rozal fraction of R_{veg}	[mm]
C_{veg}	Overland discharge	[mm h ⁻¹]
C_{veg}	Channel discharge	[mm h ⁻¹]
<i>Ecosystem Productivity</i>		
C_{veg}	Green above-ground biomass (leaves or grass) carbon pool	[gC m ⁻² PFT]
C_{veg}	Living above-ground carbon pool	[gC m ⁻² PFT]
C_{veg}	Fire fuels carbon pool	[gC m ⁻² PFT]
C_{veg}	Carbohydrate reserves carbon pool	[gC m ⁻² PFT]
C_{veg}	Net Primary Production	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Gross Primary Production	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Above-ground Net Primary Production	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Photosynthesis respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Growth respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Maintenance respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Living uprooted maintenance respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Fire root maintenance respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Carbohydrate reserve maintenance respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Foliar maintenance respiration	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Living uprooted carbon nitrogen C:N mass ratio	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Fire root carbon nitrogen C:N mass ratio	[gC m ⁻² PFT day ⁻¹]
<i>Carbon Allocation and Transfer</i>		
C_{veg}	Allocation function to green above-ground biomass	[-]
C_{veg}	Allocation function to living uprooted biomass	[-]
C_{veg}	Allocation function to fire roots	[-]
C_{veg}	Allocation function to carbohydrate reserves	[-]
C_{veg}	Allocation function to fire and flowers	[-]
C_{veg}	Carbohydrate translocation rate	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Rate of fire reserve of uprooted to harvested biomass	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Time transfer of fire root biomass to later	[gC m ⁻² PFT day ⁻¹]
C_{veg}	Time transfer of green above-ground biomass to later	[gC m ⁻² PFT day ⁻¹]
<i>Vegetation Phenology</i>		
C_{veg}	Leaf area index	[m ² leaf area/m ²]
C_{veg}	Leaf age	[days]
C_{veg}	Phenology state	[0, 1, 2]
C_{veg}	New leaf area onset over a time step Δt	[mm ² leaf area/m ² PFT day]

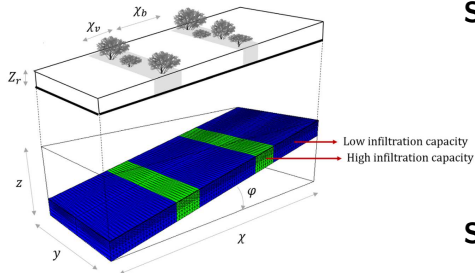
Table 1. Meteorological Input Used for Forcing “Tethys-Chloris”

Variable	Description	Units
R_{veg}	Increasing direct beam shortwave radiation	[W m ⁻²]
R_{veg}	Increasing diffuse shortwave radiation	[W m ⁻²]
R_{veg}	Increasing direct beam Photosynthetically Active Radiation	[W m ⁻²]
R_{veg}	Increasing diffuse Photosynthetically Active Radiation	[W m ⁻²]
P_{veg}	Precipitation	[mm h ⁻¹]
T_a	Air temperature at a reference height	[°C]
P_{veg}	Vapor pressure at a reference height	[Pa]
P_{veg}	Cloud cover	[-]
P_{veg}	Atmospheric pressure	[Pa]
P_{veg}	Wind speed at a reference height	[m s ⁻¹]
P_{veg}	Atmospheric CO ₂ concentration	[Pa]

Detailed simulations of banded patterns based on T&C

Simplifying Assumptions

- ▶ spatially static carbon
- ▶ Single vegetation layer
- ▶ Depth-averaged soil moisture



Idealized Hillslope

- ▶ Size: 1 km (by 2 m)
- ▶ Slope: 0.5 - 5 %
- ▶ Vegetation band width: 16 m
- ▶ Vegetation band period: 62 m

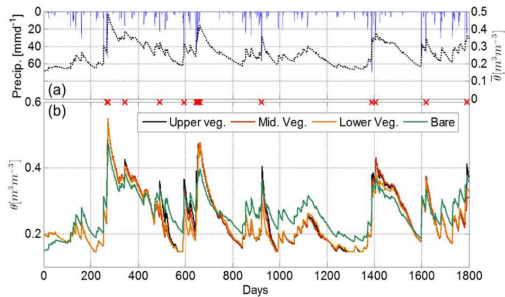
Simulation Time Steps

- ▶ Vegetation dynamics: daily
- ▶ Energy fluxes: hourly
- ▶ Soil crust formation: 5 min
- ▶ Hydrology: \sim sec - 5 min

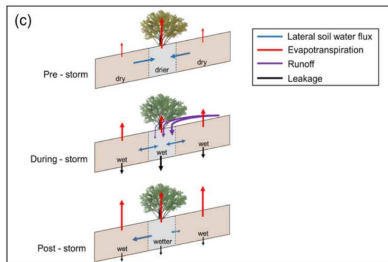
Simulation time: <20 years

A detailed simulation of banded patterns based on T&C

Time series for 5 years of simulation

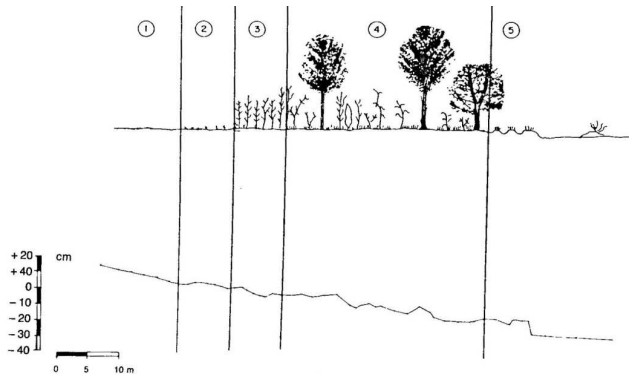


Mechanistic explanation of water fluxes

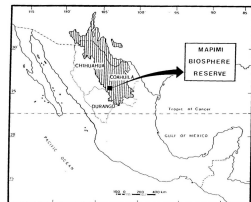


Paschalis et al., *Water Resour. Res.* **52** 2259–2278 (2016)

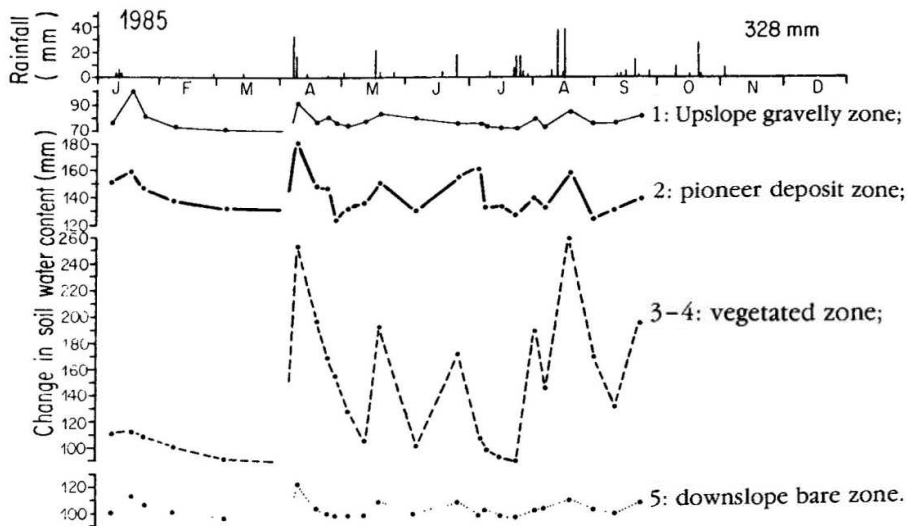
Time-resolved soil moisture data is limited



Cornet et al, "Dynamics of striped vegetation patterns and water balance in the Chihuahuan Desert." (1988)



Time-resolved soil moisture data is limited



Cornet et al. "Dynamics of striped vegetation patterns and water balance in the Chihuahuan Desert." (1988).

Presentation Outline

Existing modeling frameworks

Modeling processes on relevant timescales

Preliminary simulation results for a fast/slow model

Build off of existing modeling frameworks

Rietkerk et al., *Am. Nat.*, **160** (2002). See also: Gilad et al., *PRL*, **93** (2004).

Biomass :

$$\frac{\partial B}{\partial T} = \underbrace{-MB}_{\text{mortality}} + \underbrace{C_g \Gamma s B (1 - B/K_B)}_{\text{growth}} + \underbrace{D_B \nabla^2 B}_{\text{seed dispersal}}$$

Soil moisture :

$$\phi Z_r \frac{\partial s}{\partial T} = \underbrace{\mathcal{I}(H, s, B)}_{\text{infiltration}} - \underbrace{(L_{ev} + \Gamma B)s}_{\text{evapotranspiration}} - \underbrace{A_L s e^{\beta_L(s-1)}}_{\text{leakage}}$$

Surface water :

$$\frac{\partial H}{\partial T} = \underbrace{P(T)}_{\text{precipitation}} - \underbrace{\mathcal{I}(H, s, B)}_{\text{infiltration}} + \underbrace{K_w \frac{\partial}{\partial X} \left(\frac{\sqrt{|\nabla \zeta|} H^\delta}{1 + NB} \right)}_{\text{surface transport}}$$

$$\mathcal{I}(H, s, B) = K_{sat} \left(\frac{B + fQ}{B + Q} \right) \left(\frac{H}{H + A_I} \right) (1 - s)^{\beta_I}$$

Parameter values based on processes being modeled

Typical values for states:

- ▶ Biomass: $B \sim 0.4 - 2 \text{ kg/m}^2$ for vegetation
- ▶ Soil moisture: $S \sim 0.2 - 0.5$ during rainy season
- ▶ Surface water: $H \sim 1 - 5 \text{ cm}$ during rain events

Typical values for process being modeled:

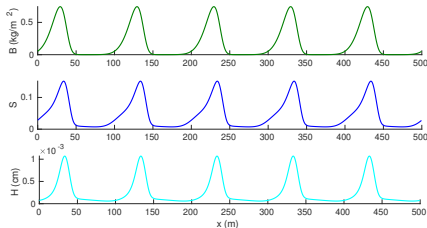
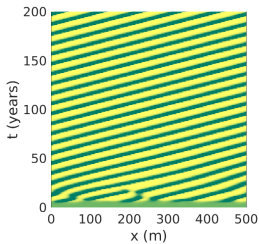
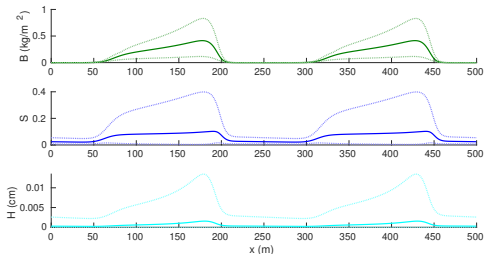
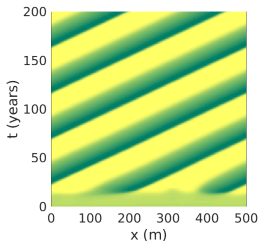
- ▶ Saturated hydraulic conductivity $\sim 20 - 200 \text{ cm/day}$
- ▶ Maximum transpiration $\sim 0.4 \text{ (cm/day)/(kg/m}^2\text{)}$
- ▶ Manning roughness coefficient $\sim 0.01 - 0.1 \text{ s/m}^{1/3}$
- ▶ Bare soil surface water flow speed $\sim 1 \text{ m/s}$

“Effective” processes in model:

- ▶ Biomass transport
- ▶ Infiltration (soil moisture/biomass dependence)

Constant and seasonal rain with 80 mm/year of rainfall

$$P(T) = P_0 C_\alpha \operatorname{sech}^2(\alpha \cos(\pi T / T_{\text{year}}))$$

constant rain ($\alpha = 0$)3 month rainy season ($\alpha = 5$)

Separation of scales suggests fast/slow model

Dimensionless equations with $\epsilon = \frac{\text{Infiltration Timescale}}{\text{Growth Timescale}} \sim 10^{-3}$

$$\begin{aligned}
 b_t &= \epsilon (db_{xx} - \mu b + sb(1-b)) & \iota &= \left(\frac{b+qf}{b+q} \right) \left(\frac{h}{h+1} \right) (1-s)^{\beta_I} \\
 s_t &= \alpha_I \iota - \epsilon \gamma (\sigma + b) s - \ell_L & \nu &= (1 + \rho b)^{-1} \\
 h_t &= p(t) - \iota + \partial_x (\nu h^\delta) & \ell_L &= \alpha_L s e^{\beta_L(1-s)}
 \end{aligned}$$

Alternative approach: fast/slow system

Fast System, $\epsilon = 0$
(minutes - hours)

$$\begin{aligned}
 b_t &= 0 \\
 s_t &= \alpha_I \iota - \ell_L \\
 h_t &= p(t) - \iota + \partial_x (\nu h^\delta)
 \end{aligned}$$

Slow System, $h = 0$, $\tau = \epsilon t$
(weeks - months)

$$\begin{aligned}
 b_\tau &= db_{xx} - \mu b + sb(1-b) \\
 s_\tau &= -\gamma (\sigma + b) s \\
 h &= 0
 \end{aligned}$$

Presentation Outline

Existing modeling frameworks

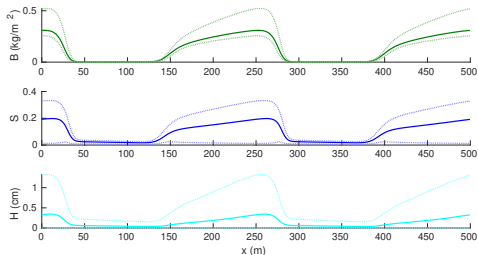
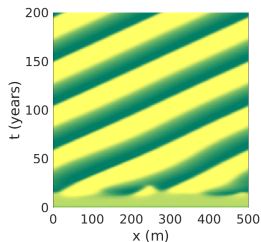
Modeling processes on relevant timescales

Preliminary simulation results for a fast/slow model

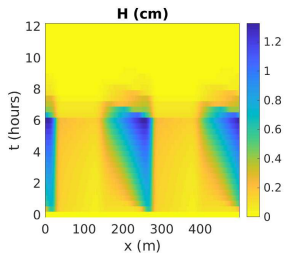
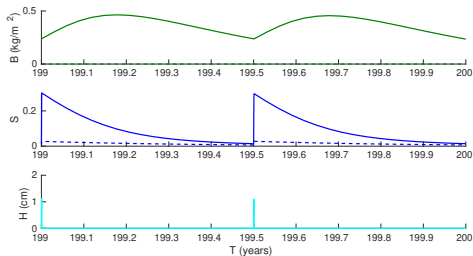
Simulation of fast/slow model with 80 mm/year rainfall

two 6-hour rain events

Spatial profile: annual avg. (solid), max/min (dotted)

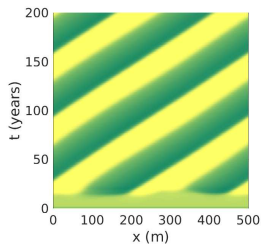


Time series in vegetation band (solid), in bare soil (dashed)

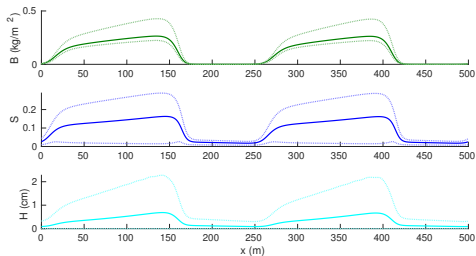


Rain intensity for 80 mm/year of rainfall

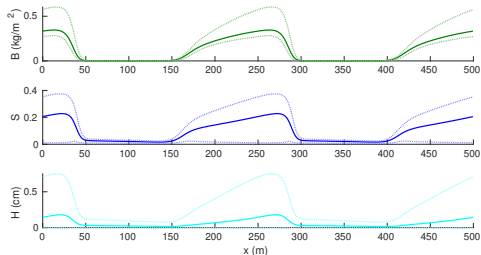
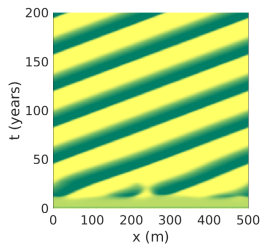
two 3-hour rain events



Spatial profile: annual avg. (solid), max/min (dotted)

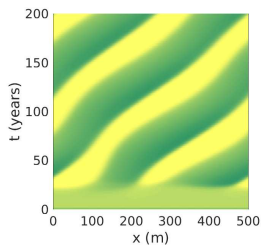


two 12-hour rain events

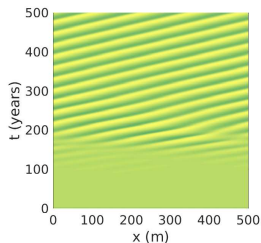


biomass feedback on infiltration and surface transport

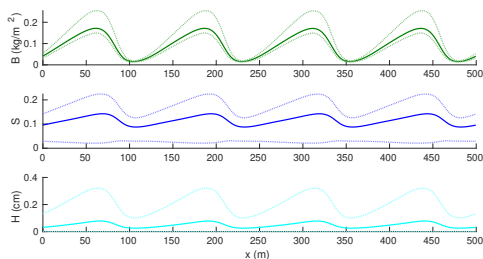
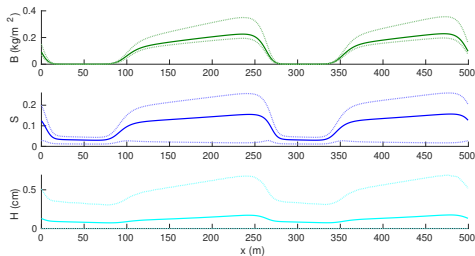
weak surf. feedback ($N = 5$)



no infl. feedback ($f = 1$)



Spatial profile: annual avg. (solid), max/min (dotted)



Approximations in fast system for computational speed up

Rain: $s \rightarrow s + \theta[b, s, h_0]$

(slow) time evolution until next rain:

$$b_\tau = db_{xx} - \mu b + sb(1 - b)$$

$$s_\tau = -\gamma(\sigma + b)s$$

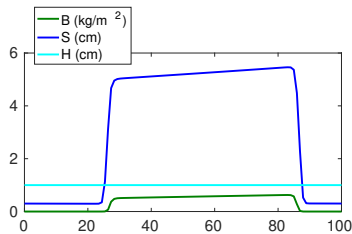


Merlin Pelz

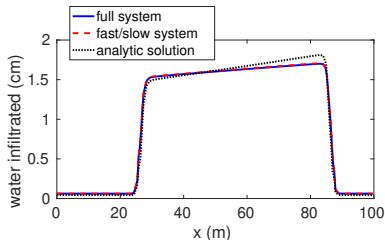
(TU Munich)

Use fast system to update soil moisture profile after rain

assume delta function rain event, $\delta = 1$ and $h, s \ll 1 \rightarrow$ Analytic solution for $\theta[b, s, h_0]$



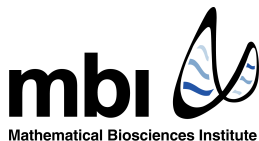
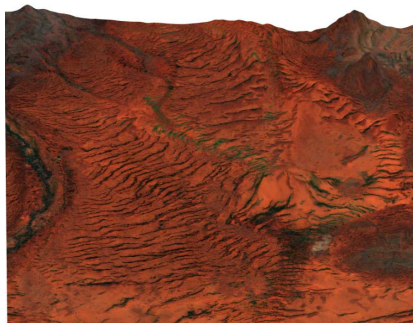
Initial condition



After 1 cm rain impulse

Outlook

- ▶ Target: Resolve timescales of underlying processes
- ▶ Additional features needed: runoff, biomass processes, . . .
- ▶ Fast/slow system: Stochasticity, approximate analytic solutions, relation to “full” model



The Mathematical Biosciences Institute receives major funding from the National Science Foundation under grant DMS 1440386 and is supported by The Ohio State University.