CanVeg

March 18, 2024

This document provides background and literature supporting the Matlab version of Canveg.

This version was developed in 2020 and is applied to an alfalfa canopy and tested with eddy flux data. The goal is to use the new version to help interpret results from our NASA ECOSTRESS project.

The current version has been parameterized for alfalfa and tules.

Canveg is a coupled biophysical model that computes water, CO2, sensible heat and energy fluxes from vegetated canopies. It has also been applied to study stable isotopes (Baldocchi & Bowling, 2003, Oikawa *et al.*, 2017) and isoprene (Baldocchi *et al.*, 1999). It was originally developed in C and applied to a deciduous forest (Baldocchi & Harley, 1995, Baldocchi & Wilson, 2001, Baldocchi *et al.*, 2002). Over the years I have tried to simplify and generalize the model for a variety of vegetation types (Baldocchi & Meyers, 1998).

The intent of the model is to digest a simple set of meteorological variables above a plant canopy and use that information that drives algorithms that can compute the microclimate within the vegetation and the fluxes of mass and energy between vegetation, the soil and the atmosphere.

The model is multi-layered one dimensional. This version is coded in Matlab and the model was recasted in matrix form for faster execution. The model operates with n columns for each layer in the canopy and atmosphere and m rows for each half-hourly input. The model is mostly diagnostic and many subroutines are analytical equations for leaf temperature, evaporation, and photosynthesis (Baldocchi, 1994); details of the equations used are reported in the appendix of the cited paper (Baldocchi *et al.*, 1999). A schematic of the model is shown in Figure 1.

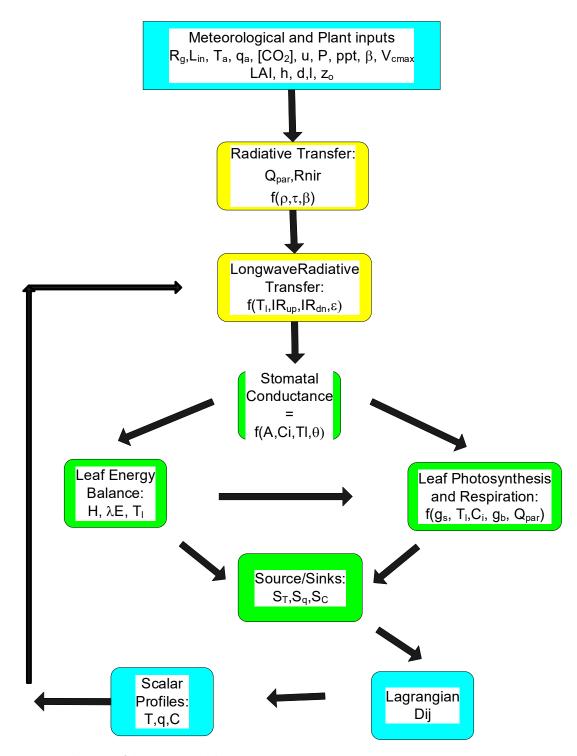


Figure 1 Schematic of the CanVeg model

Conceptually, the model first computes radiative transfer of shortwave visible and near infrared radiation into and out of the vegetation (Norman, 1979). These energy fluxes drive an energy balance model (Paw U & Gao, 1988, Raschke, 1960) that then is used to compute infrared radiation fluxes, latent and sensible heat exchange and leaf temperature. This new information on IR fluxes is used to reinform energy balance computations, which are repeated in an iterative fashion.

Because many of the functions are non-linear, the model computes fluxes separately on the sunlit and shaded fractions of each layer (Norman, 1981, Norman, 1993).

Leaf energy balance depends upon stomatal conductance. We compute stomatal conductance with a model that is dependent upon photosynthesis, so this requires a photosynthesis module (Collatz *et al.*, 1991). Photosynthesis is computed with the widely used Farquhar, von Caemmerer, Berry model (Farquhar *et al.*, 1980). Once sources and sinks are estimated we compute profiles of scalars, using a Lagrangian random walk model (Raupach, 1987). These new estimates of scalar fields are also used to update and refine computations of sources and sinks.

At present we are running the model through 15 iterations, which seems to make convergence.

The vegetation module overlies soil module that computes heat and moisture transfer (Campbell, 1985).

The architectural flow chart of the code runs as follows.

Subroutines	
<pre>[prm]=parameter_alfalfa();</pre>	Reads all the model parameters as a structure
[DIJ]=DispCanveg_v2a(prm);	Compute the Dispersion matrix. It only changes with LAI, so it can be run once, and output can be saved and read for future runs
<pre>inmet=csvread('AlfMetBouldinInput.csv');</pre>	Input meteorological conditions; check code for inputs and their order. Day, hour, solar radiation, air temperature, humidity, wind speed, friction velocity, pressure, CO2 concentration are main inputs. Also can add aerodynamic height, inferred LAI, and water table.
<pre>[soil] = fSetSoilAlfalfa(met, prm);</pre>	Set and input soil parameters
<pre>[quantum, nir, ir, Qin, rnet, Sun, Shade] =fZeroArrays(prm);</pre>	Zero and pre-allocate Arrays for faster execution
<pre>sunang= fSunAngle(prm.time_zone,prm.lat_deg, prm.long_deg, met.day, met.hhour);</pre>	Compute sun angles
<pre>[sunrad]=fDiffuse_Direct_Radiation (met.rglobal,met.parin,met.P_kPa, sunang.sine_beta);</pre>	Computes fraction of direct and diffuse light to apply the model on sun and shaded leaf fractions
<pre>[leafang]=LeafAngle(sunang, prm);</pre>	Computes the G function, the direction cosine between leaf normal and the sun for

	prescribed leaf angle distributions
<pre>[prof]=initial_profile_Matrix(met,prm);</pre>	Pre-allocates arrays for profiles of scalars and fluxes
<pre>[prof.wind] = fUZ_Matrix (met, prm);</pre>	Computes empirical wind speed profile in canopy to estimate boundary layer conductances
<pre>[quantum]=fRadTranCanopy_MatrixV2(sunang,leafang, quantum,waveband,prm);</pre>	Computes Radiative transfer for specific wave bands, eg PAR, NIR. If you have spectral information you look at narrow wave bands, SIF, etc
<pre>[nir]=fRadTranCanopy_MatrixV2(sunang,leafang, nir,waveband,prm);</pre>	Computes Radiative transfer for specific wave bands, eg PAR, NIR. If you have spectral information you look at narrow wave bands, SIF, etc
Start Iteration Loop {	
<pre>[ir]= fIR_RadTranCanopy_Matrix(leafang,ir,</pre>	Computes IR fluxes based on
quantum, met, Sun, Shade, prm);	information on leaf temperature
[Qin]=fQin_Matrix(quantum,nir,ir,prm);	Computes incoming longwave and shortwave energy absorbed by each layer
<pre>[Sun, Shade] = fEnergy_Carbon_Fluxes_Matrix(Sun, Shade, Qin, quantum, met, prof, prm);</pre>	Computes carbon, water and energy fluxes for each layer for sun and shaded leaf fractions. This master sub routine calls routines for leaf boundary layer resistance, leaf energy balance and photosynthesis. Leaf -air temperature is used to assess whether the boundary layer is affected by convection or free convection.
<pre>[soil]=fSoilEnergyBalanceMatrix(quantum, nir,ir, met, prof, prm, soil,j);</pre>	Compute Soil Energy balance Fluxes
<pre>[prof.Tair_K] = fConcMatrix(prof.H, soilflux, prof.delz, Dij, met, met.T_air_K, prm, fact.heatcoef);</pre>	Compute sources and sink strengths and use them and Dij to compute scalar profiles for air temperature, humidity and CO2.
End Iteration Loop	
	Sum Layers and compute Canopy fluxes weighted for sun/shade fractions

Plot and visualize

The model is being tested with a set of data from days 141 to 157, 2019 over Bouldin Alfalfa, an Ameriflux site in northern California, between Rio Vista and Lodi (https://ameriflux.lbl.gov/sites/siteinfo/US-Bi1).

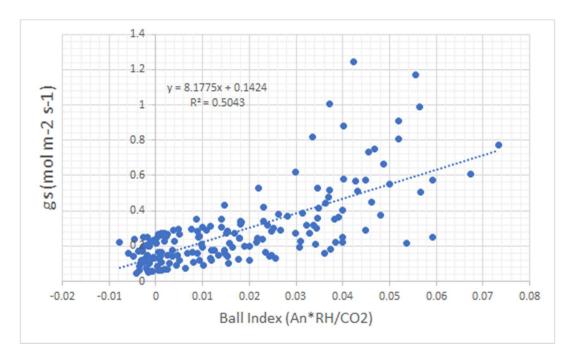
For this test, the canopy was fully developed, with a leaf area index of about 6 and a height of 0.85 m. We assume the leaves were 2.5 cm in length and that the leaf angle distribution was spherical.

Parameterizations

We are basing these computations on the fact that alfalfa are amphistomatous. Prior to model developed I rederived the leaf energy balance equations from scratch. These equations are in a separate document

We collected original data for the leaf photosynthesis model using A-Ci measurements from the field

August 31, Camilo has update on parameters



Vcmax and Jmax was computed using the Sharkey algorithms (Sharkey *et al.*, 2007) based on measurements between Sep 2019 to August 2020 (n=25), the averages and the standard error are:

Vcmax= 165 +- 5.54 umol m-2 s-1

Jmax= 260 +- 12.41 umol m-2 s-1 Rd= 2.68 +- 0.09 umol m-2 s-1

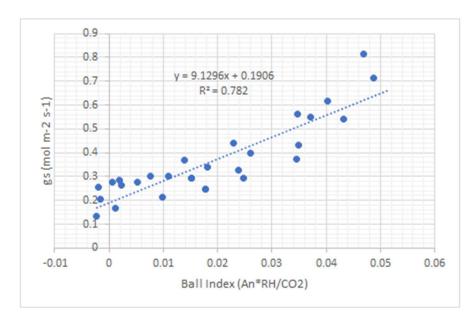
The Sharkey function computed these for 25 C.

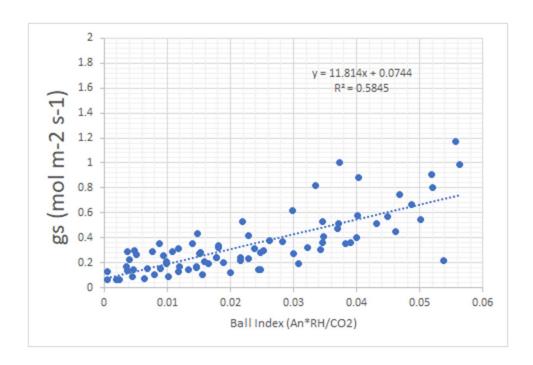
I needed to adjust the Boltzmann functions to normalize to 25 C. The older code was set to Topt.

There is essentially no published data on alfalfa stomatal conductance in the literature

Ball Berry coefficient were derived from the gas exchange measurements of Dr. Camilo Rey Sanchez. He derived these coefficients from Light Response Curves on alfalfa leaves in the field.

Here is a curve from 2020. Circa Aug 2021 was finding the model was computing LE too too large using the other bb slope of 11.8. Using the smaller, 9 value, is giving very good LE and Ps values

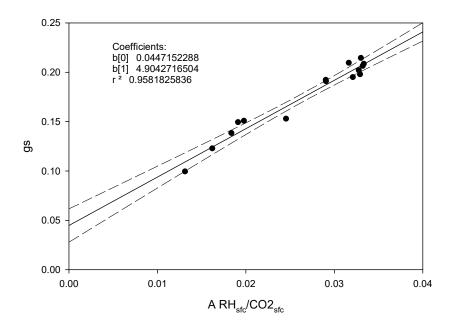




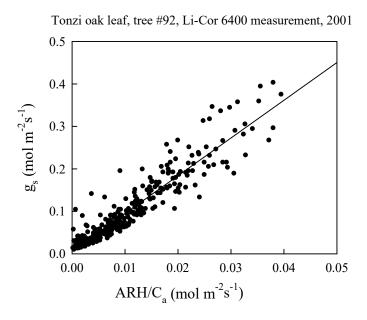
We discovered that the intercept of the Ball Berry model was much larger than most observations in the literature. And, the large values were causing LE to be too big at night and H to be to negative during the day. We downscaled g0 based on data from other studies (Franks *et al.*, 2018, Medlyn *et al.*, 2011, Xu & Baldocchi, 2003).

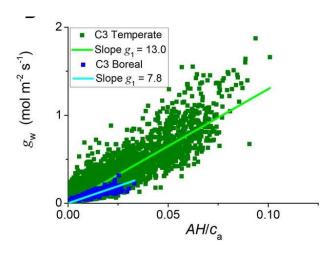
The next figure shows an estimate of g0 from an A-Ci curve on alfalfa that is much smaller than the previous data. This data set was collected on a very hot day, 35 C and greater, on August, 2019. So, we are reluctant to use these data instead. Plus these data are confined to CO2 concentrations near ambient. The figure is more scattered if the whole A-Ci curve is used.

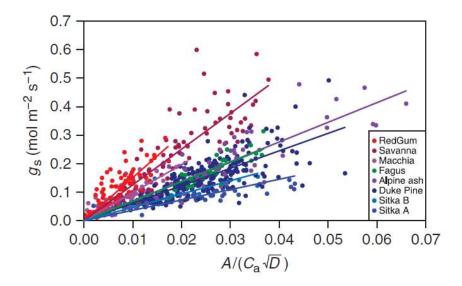
Alfalfa, Aug 2019, from A-Ci curve



Xu finds a tiny value for g0 for blue oak. When collecting these data, Xu would take 20 minutes for stomata to adjust to get high precision values; the scatter is much smaller compared to the r2 of 0.54 shown above. Our quickly attained values may account for the larger degree of scatter seen above; leaks through seals can play a role, too, explaining the higher than expected value for g0.







The Licor 6400 was correctly adjusted to consider amphistomatous leaves. We applied the following theory to compute total leaf conductance to water vapor.

Stomatal Conductance to Water Vapor

The stomatal conductance g_{sw} to water vapor (mol H₂O m⁻² s⁻¹) is obtained from the total conductance by removing the contribution from the boundary layer.

$$g_{sw} = \frac{1}{\frac{1}{g_{tw}} - \frac{k_f}{g_{bw}}} \tag{1-9}$$

where k_f is a factor based on the estimate K of the fraction of stomatal conductances of one side of the leaf to the other (termed stomatal ratio throughout this manual),

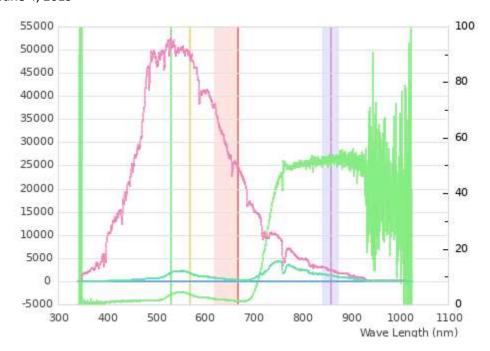
$$k_f = \frac{K^2 + 1}{(K+1)^2} \tag{1-10}$$

and g_{bw} is the boundary layer conductance to water vapor (mol H₂O m⁻²s⁻¹) from one side of the leaf. The boundary layer conductance correction thus depends on whether the leaf has stomata on one or both sides of the leaf.

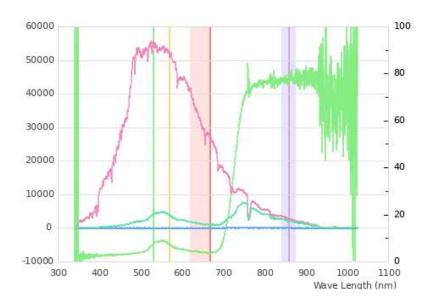
Leaf Reflectance and Transmittance

UCD presentation shows NIR reflectance and transmittance are about the same

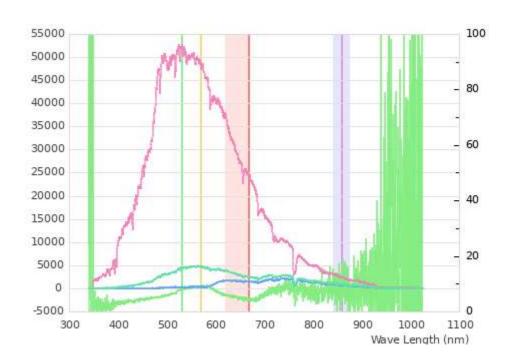
June 4, 2019



Ocean Optics Sept 17, 2019



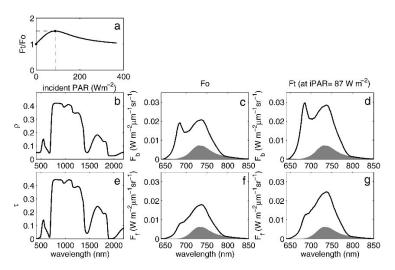
May 2, 2019.. Alfalfa had been cut



The literature has a couple of papers with leaf spectra in the PAR and NIR bands

van der Tol, Christiaan, Micol Rossini, Sergio Cogliati, Wouter Verhoef, Roberto Colombo, Uwe Rascher, and Gina Mohammed. 2016. 'A model and measurement comparison of diurnal cycles of sun-induced chlorophyll fluorescence of crops', *Remote Sensing of Environment*, 186: 663-77.

Applied SCOPE to alfalfa



Another paper reports data from LOPEX study in Germany, which may be a similar site as used by van del Tol and the SCOPE team.

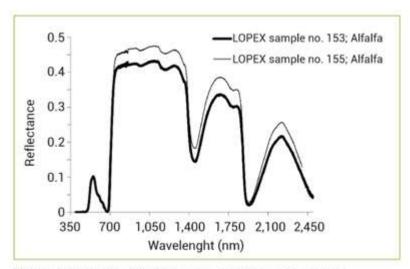


Figure 1. Samples of Alfalfa spectral reflectance curves.

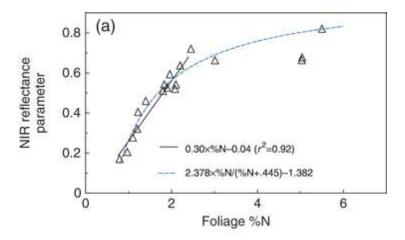
Mobasheri, Mohammad Reza, and Sayyed Bagher Fatemi. 2013. 'Leaf Equivalent Water Thickness assessment using reflectance at optimum wavelengths', *Theoretical and Experimental Plant Physiology*, 25: 196-202.

Weighted average reflectance for NIR is 0.36

```
%%% estimate NIR reflectances for alfalfa
midpt=[850, 1100,1300,1500,1700,1900,2050,2300];
range =[300,200,200,200,200,200, 100,400];
```

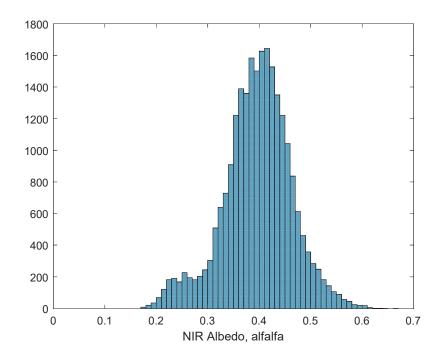
```
midpt_m=midpt*10^-9; % convert nanometers to meters
Emidpt=Planck(5700,midpt_m);
reflect=[0.4,0.4,0.4,0.2,0.35,0.3,0.05,0.2];
weight ave3=sum(Emidpt.*reflect.*range)./sum(Emidpt.*range);
```

In lieu of direct measurements, we know NIR reflectance is a function of leaf N and alfalfa is an N fixer (Hollinger *et al.*, 2010). So we should adapt our value of leaf N to reflected NIR



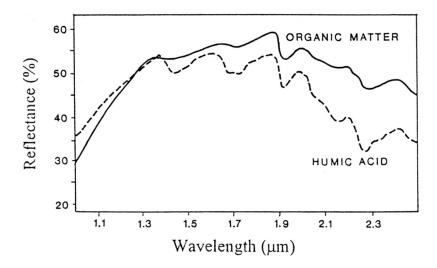
In producing model results we performed many tests on functions and variables to make sure we have the right units and they are functioning correctly

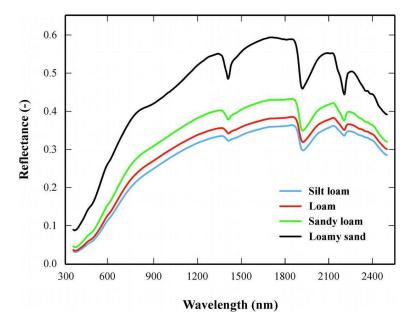
Histogram of NIR reflected by the canopy in the field



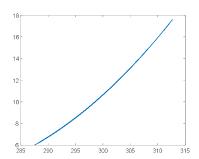
Doughty sees darkening of NIR in tropics with warming. What does change in NIR have on ET and Tsfc

Organic soil reflectance

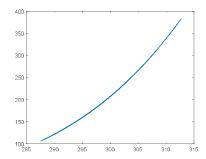




d2dest vs Tk

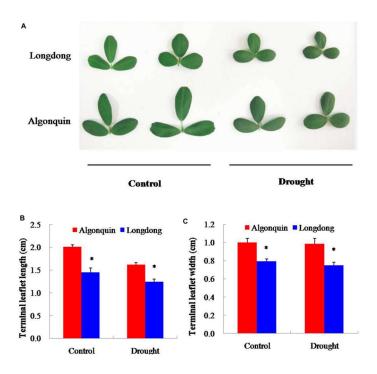


dest vs Tk, Pa/K



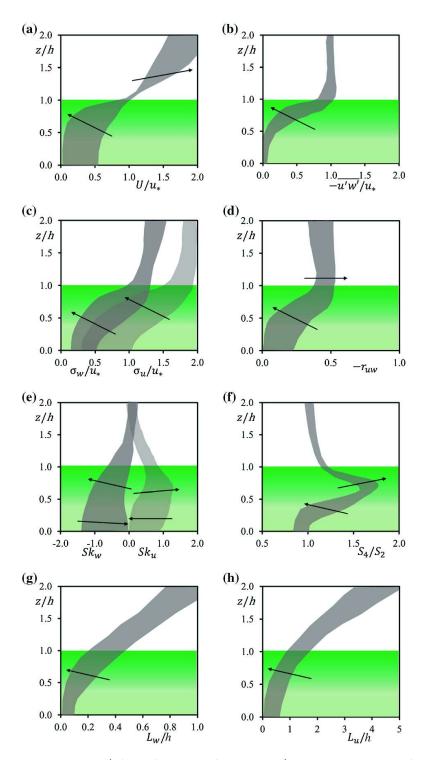
Leaf size was selected from papers in the literature as we did not have any direct measurements handy.

Typical leaf size

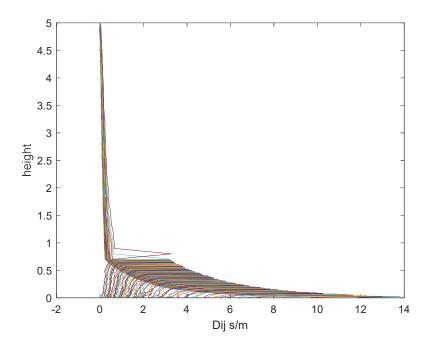


• DOI:<u>10.3389/fpls.2015.01256</u>

The dispersion matrix, Dij, was computed using a Lagrangian random walk model (Raupach, 1987, Raupach, 1989). This model requires we prescribe information on the heterogeneity of turbulent mixing in the canopy. Several authors have produced family portraits of these traits (Brunet, 2020, Finnigan, 2000, Raupach, 1988).

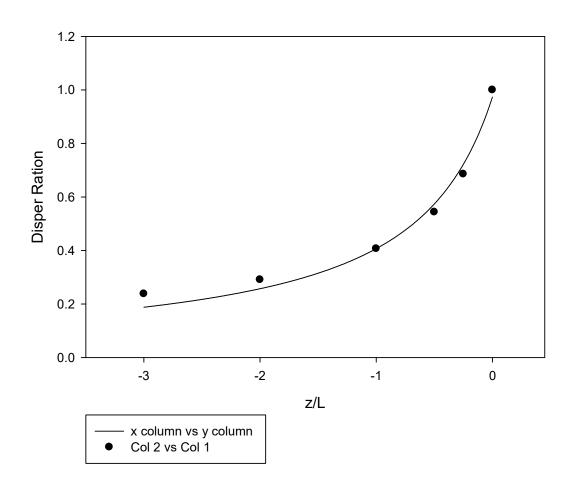


Because std w/u^* is a function of stability, z/L, we ran the model for various stability conditions and produced a simple scaling function for the reference value, computed at u^* equal 1 m/s and neutral conditions.



Because the height of the layers inside the canopy and atmosphere vary in this version with leaf area index, we need to recompute Dij for changes in leaf area index. Running 1,000,000 particles yields smoothest Dij

Dispersion Matrix, Alfalfa



Nonlinear Regression

Data Source: Data 1 in Notebook1

Equation: Hyperbola, Hyperbolic Decay, 2 Parameter

f=(a*b)/(b+x)

R	Rsqr Adj Rsqr		Standard Erro	Standard Error of Estimate								
0.9917	0.9836	0.9794	0.0407									
	Co	efficient Std. Ei	rror t	P	VIF							
a b	0.97 -0.71		25.8669 -8.1523	<0.0001 0.0012	1.8654 1.8654							

Soil Heat Transfer

Adopting C code developed from Soil Physics in Basic (Campbell, 1985).

Also consulting new Python version of Campbell's work by Marco Bitelli

The complication I am having is matlab does not consider an index of zero in Arrays and the C and Python Code have that.

```
%% fraction porosity + mineral + organic = 1
 % airborne fraction = porosity - volumetric water content
       soil.bulkdensity=1.06; % g cm-3 Data from Tyler Anthony
       soil.bulkdensity kg m3 = soil.bulkdensity *100*100*100/1000;
       soil.pore fraction = 1-soil.bulkdensity/2.65; %// from alfalfa, 1
minus ratio bulk density 1.00 g cm-3/2.65 g cm-3, density of solids
       Kuno Kasak, 2019 Bouldin Alfalfa
       soil.mineral fraction= 1-soil.pore fraction -soil.peat fraction ; %
// from bulk density asssuming density of solids is 2.65
       soil.air fraction = soil.pore fraction - met.soilmoisture;
       soil.Cp water= 4180; % // J kg-1 K-1, heat capacity
       soil.Cp air = 1065;
       soil.Cp org = 1920;
       soil.Cp mineral = 870;
       soil.K mineral= 2.5; % // W m-1 K-1, thermal conductivity
       soil.K org= 0.8;
       soil.K water= 0.25;
```

Corrected the parameter for computing the boundary layer resistance at the soil surface (Daamen & Simmonds, 1996). Our past work in Oregon found the need to apply this algorithm as soil get too hot without it. Heating causes convection that enhances heat transfer and acts as a feedback on surface temperature

```
%// Stability factor from Daamen and Simmonds 1996 WRR % older parameterization was blowing up. Went back to original paper and
```

Future work is to code up photosynthesis for corn, C4 (Collatz *et al.*, 1992, Yin & Struik, 2009, Zhou *et al.*, 2019)

Soil Info fro SoilWeb

soil.Rv_soil=Rv_soil; soil.Rh soil=Rh soil;

https://casoilresource.lawr.ucdavis.edu/gmap/?loc=38.10034,-121.50163,z17

50% Ryde

R	ept h ang e cm)	Horizon Designati on	Perce nt Clay	Perce nt Sand	Perce nt Organ ic Matter	pH by water Extracti on	Sat. Hydraulic Conductiv ity (mm/hr)	EC (dS/ m)	SA R (%)	Carbonat es (% of < 2 mm)	(% of <	CEC at pH 7 (cmol charg e / kg soil)	K Fact or	LE P	Oven- Dry Db (g/cm
0	- 20	Ap	31	35	6	6.2	9.72	1	1	0	0	26.4	.20	3.1	1.44
2	20 - 61	Α	31	35	6	6.2	9.72	1	1	0	0	26.4	.24	3.1	1.35
6	61 - 81	Ab	31	35	20	5	32.4	1	1	0	0		.24	2	0.68

81 - 200	Cg	33	15	20	7.2	32.4	1	1	0	0	41.9	.24	2.2	0.94

All Horizon Data

35% Peltier

Dept h Rang e (cm)	Horizon Designati on	Perce nt Clay		Perce nt Organ ic Matter	pH by water Extracti on	Sat. Hydraulic Conductiv ity (mm/hr)	EC (dS/ m)	SA R (%)	Carbonat es (% of < 2 mm)	m (% of < 20	7	K Fact or	LE P	Oven- Dry Db (g/cm
0 - 56	Ар	31	35	17.5	6.5	32.4	1	1	0	0	46.4	.24	2.1	0.67
56 - 61	BA	40	8	16	6.7	3.276	1	1	0	0	48.4	.32	3.2	1.06
61 - 114	Bw	39	25	18	6.7	32.4	1	1	0	0	50.1	.20	3	0.76
114 - 152	2Cg	42	28	1	6.7	3.276	1	1	0	0	32.4	.28	6.7	1.7

All Horizon Data

5% Rindge

We also have soil information from Kuno Kasak and Tyler Anthony

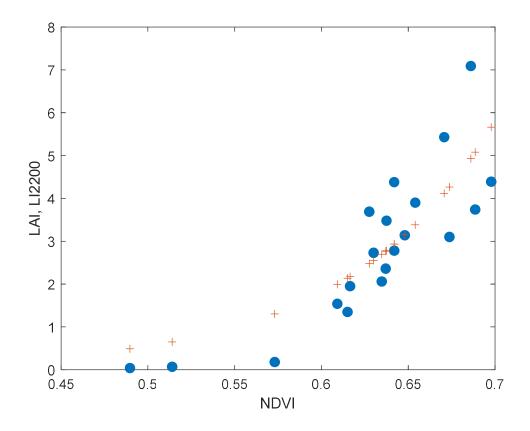
LAI of alfalfa.

B(1,2)

0.00153718160439161

11.7678244178294

LAI=0.001537*exp(11.76 * NDVIavg);



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