6967

Hydrol. Earth Syst. Sci. Discuss., 6, 6967–6999, 2009 www.hydrol-earth-syst-sci-discuss.net/6/6967/2009/ © Author(s) 2009. This work is distributed under the Creative Commons Attribution 3.0 License.

This discussion paper is/has been under review for the journal Hydrology and Earth System Sciences (HESS). Please refer to the corresponding final paper in HESS if available.

Contribution of soil moisture feedback to hydroclimatic variability

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Received: 21 October 2009 - Accepted: 29 October 2009 - Published: 12 November 2009

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Published by Copernicus Publications on behalf of the European Geosciences Union.





Abstract

While a variety of model experiments and analyses of observations have explored the impact of soil moisture variation on climate, it is not yet clear how large or detectable soil moisture feedback is across spatial and temporal scales. Here, we study the im-

pact of dynamic versus climatological soil moisture in the GISS GCM ModelE (with 5 prescribed sea-surface temperatures) on the variance and on the spatial and temporal correlation scale of hydrologically relevant climate variables (evaporation, precipitation, temperature, cloud cover) over the land surface. We also confirm that synoptic variations in soil moisture have a substantial impact on the mean climate state, because of the nonlinearity of the dependence of evapotranspiration on soil moisture. 10

We find that including dynamic soil moisture increases the interannual variability of seasonal (summer and fall) and annual temperature, precipitation, and cloudiness. Dynamic soil moisture tends to decrease the correlation length scale of seasonal (warmseason) to annual land temperature fluctuations and increase that of precipitation. Dy-

namic soil moisture increases the persistence of temperature anomalies from spring to 15 summer and from summer to fall, and makes the correlation between land precipitation and temperature fluctuations substantially more negative. Global observation sets that allow determination of the spacetime correlation of variables such as temperature, precipitation, and cloud cover could provide empirical measures of the strength of soil moisture feedback, given that the feedback strength varies widely among models. 20

Introduction 1

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Climate feedbacks involving land-atmosphere fluxes of water, sensible heat, radiation, and dust have been extensively studied using numerical models and observations. Land-surface fluxes have been implicated as important contributors to extreme climate events including the 1930s North American Dust Bowl (Koven, 2006; Cook et al., 2008, 2009), more recent droughts in the United States (US) (Trenberth and Guillemot, 1996;



Hong and Kalnay, 2000), the 2003 European heat wave (Fischer et al., 2007; Zampieri et al., 2009), and, somewhat controversially, desertification in the Sahel (e.g. Charney et al., 1975; Zeng et al., 1999). Because land-surface conditions can have a long "memory", a better understanding of land-surface fluxes would enable improved seasonal prediction of weather and weather-related processes such as reservoir storage, crop growth, and epidemic outbreak. It could also permit better targeting of alterations to the land surface (e.g. forestation of desert boundaries, Liu et al., 2008; Ornstein et al., 2009) to achieve desirable climate consequences.

A simple, and important, climate system feedback involving the land surface acts through evapotranspiration rate (Shukla and Mintz, 1982). Over most of the land surface, moisture availability at the soil surface and in the root zone limits evapotranspiration at least seasonally. This moisture availability depends on recent precipitation, and, in turn, the evapotranspiration rate affects atmospheric temperature, water vapor content, and local or downwind cloudiness and precipitation. This feedback could have a substantial effect both on mean climate and on the occurrence and persistence of dry or wet spells and thus be important for applications such as seasonal drought prediction. A number of numerical modeling investigations have been undertaken to characterize the strength and effects of this feedback.

A common general approach to diagnose soil moisture feedback in numerical models has been to evaluate the variability of evaporation, precipitation, and temperature in runs where soil moisture is prescribed as compared to runs where soil moisture is allowed to vary (e.g. Schlosser and Milly, 2002; Koster et al., 2002, 2004; Conil et al., 2007). The time scales of variability examined are typically days to months. The general finding of these modeling investigations has been that soil moisture variability is

an important determinant of variability in precipitation and other meteorological variables, but that the degree and geographical distribution of this influence depends on the model used. This dependence is not surprising, because the precipitation of water evaporated from the land surface is represented only crudely in current numerical models of global climate; modeled soil moisture feedback on climate can vary dramatically



depending on model resolution and on the parameterization of small-scale convection (Hohenegger et al., 2009) As evidence that modeled soil moisture feedbacks do represent some aspects of actual climate, model synoptic forecasts and seasonal hindcasts have been found to show improved skill when using observation-based as compared

- to climatological or model-derived soil moisture boundary conditions (e.g. Yang et al., 2004; Conil et al., 2007; Jeong et al., 2008). Observed correlations between past soil moisture and meteorological variables including precipitation, mean temperature, and diurnal temperature range have also been studied as evidence for soil moisture feedback (e.g. Findell and Eltahir, 1997; Luo et al., 2007; Zhang et al., 2008, 2009).
 However, correlations that are not local are hard to detect with this approach, and care
- needs to be exercised not to attribute to soil moisture feedback meteorological persistence that may in fact have other causes (e.g. Wei et al., 2008).

Several previous studies have used model simulations to quantify the impact of soil moisture feedback on seasonal to interannual climate statistics. Koster et al. (2000)

- ¹⁵ compared the variance of annual precipitation in ensembles of 200-year atmospheric general circulation model runs with dynamic versus fixed land-surface moisture availability (expressed as "evaporative efficiency"), finding that interactive moisture availability substantially increased precipitation variance over most tropical and midlatitude land areas, and that moisture availability variation contributed more than variation in
- sea surface temperatures to interannual precipitation variance in many midlatitude land regions. Reale and Dirmeyer (2002) and Reale et al. (2002) considered mean climate state and interannual precipitation variance under fixed versus interactive evaporative efficiency in 49-year model runs, finding that interactive moisture availability changes mean climate and circulation patterns and that precipitation variance responds rather
- nonlinearly to the combined interannual variability of sea surface temperature and soil moisture. Schubert et al. (2004) compared a 100-year model run with interactive soil moisture with one that had fixed land-surface evaporative efficiency, finding that over the Great Plains interactive soil moisture not only greatly increases the interannual variance of evaporation and precipitation but also introduces a positive autocorrelation of



annual precipitation that does not exist in the absence of soil moisture feedback, i.e., sequences of consecutive wet or dry years become more common.

Here, we extend these studies by explicitly examining how soil moisture feedback changes the spatial and temporal scale of seasonal to annual climate anomalies. To

do this, we calculate measures of correlation length and time scales of evaporation, precipitation, temperature, and cloudiness. This analysis is relevant to questions such as whether soil moisture feedback tends to make droughts longer and bigger in spatial extent, and if so, where this effect is largest. It also contributes to basic understanding of soil moisture feedback in models versus observations and provides new avenues for applications of this understanding to drought prediction and land-surface modification.

2 Methods

2.1 Model simulations

The modeling experiments were conducted with the Goddard Institute for Space Studies (GISS) ModelE at 2° latitude by 2.5° longitude horizontal resolution and with 40
vertical layers (Schmidt et al., 2006). ModelE is a state of the art atmospheric general circulation model, incorporating significant updates to the physics compared to previous versions. Simulations of contemporary climate in ModelE have been found to compare favorably with observations, with some notable biases, particularly in the subtropical marine stratocumulus regions. The GISS model replicates the climate of the 20 th Century, including trends and low and high frequency variability, when forced with

modern forcings and observed sea surface temperature (SST) (Hansen et al., 2007). The land model in ModelE is primarily as described by Rosenzweig and Abramopoulos (1997), with a substantially revised and improved canopy conductance scheme (Friend and Kiang, 2005). The model computes properties and fluxes for each land gridcell assuming seperate bare soil, vegetated area, and lake fractions. There are six





ture are calculated separately for bare soil and vegetated gridcell fractions. By default, soil moisture is dynamic, changing as a result of surface evaporation, extraction by plant roots, percolation of precipitation, and transport between soil layers.

Natural vegetation cover is based on Matthews (1983) and is constant over time. For ⁵ gridcells with cropland, historical crop area is taken from the dataset of Ramankutty and Foley (1999) and is updated every ten years. All of our simulations are forced with observed sea surface temperatures from HadISST1 (Rayner et al., 2003).

The results presented here are from 30-year simulations with the GISS ModelE for 1951–1980. Starting from a generic 20th Century initial condition, the model was in-

- tegrated for two successive 30-year 1951–1980 periods with the default dynamic soil moisture behavior to ensure that the temperature and moisture content of the lower soil layers were near equilibrium. From a third successive 1951–1980 integration with dynamic soil moisture (DYNA), mean monthly soil moisture for each of the 6 soil levels was then used to construct a soil moisture climatology for each layer and calendar
- ¹⁵ month. We then carried out another integration (CLIM) with the same SST and initial condition as DYNA. The only difference between the CLIM and DYNA integrations was that in CLIM, soil moisture in each soil layer did not evolve dynamically but instead was fixed to the climatology obtained from the DYNA integration (whose monthly mean values were interpolated to a daily timestep with a cubic spline), so that it had the mean spatial and seasonal variability but no synoptic or interannual variability. Thus,
- soil moisture feedback was effectively turned off in the CLIM integration.

2.2 Analysis

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We considered the impact of the presence or absence of soil moisture feedback on the following climate fields: (a) evaporation, (b) surface air temperature, (c) precipitation, (d) fractional cloud cover. Together, these fields set the most significant terms of energy and water balance. Evaporation is expected to be most directly associated with local soil moisture levels and thus to be most sensitive to whether soil moisture is dynamic or fixed, while the other fields are strongly affected by large-scale transport as well as



local fluxes and thus may be less sensitive.

For each climate field, we examined the difference in annual and seasonal mean values between the runs DYNA and CLIM. While the mean soil moisture at each grid cell and time of year was designed to be the same between the DYNA and CLIM runs,

we nevertheless expected that mean climate state could differ substantially between the two runs because of the nonlinear response of evaporation to soil moisture. Where near-surface soil moisture alternates between close to saturation (typically after rain) and much less than saturation, imposing the average soil moisture value will tend to lead to higher average evaporation as compared to allowing realistic soil moisture fluctuations. We did indeed find this sort of response (see below).

In addition to the mean state, we calculated the interannual variance of annual and seasonal means for each run. The reduction in interannual variance without soil moisture feedback is an indication of the fraction of variability in seasonal and annual scale climate (for example, pluvials and droughts) contributed by soil moisture feedback.

- ¹⁵ We wanted to assess the impact of soil moisture feedback not only on the mean and variance of climate, but also on the persistence of anomalous climate in space and time over timescales of seasons and years. For each climate variable and grid cell, we calculated the sample autocorrelation of the 12-month moving average of the variable at a 12-month lag (r_{12}). Assuming that the lagged autocorrelation decays exponentially with lag, we then defined the correlation timescale (in years) as $\tau_c = -1/\ln(r_{12})$ (or 0 if
- $r_{12} \le 0$). To quantify correlation at seasonal time scales, we also calculated, seperately for each season, the sample autocorrelation of the 3-month moving average of the variable at a 3-month lag (for example, the 3-month lagged correlation between precipitation in April-May-June and precipitation in July-August-September of the same
- year). We defined a correlation length scale for a climate variable as the decay length of the spatial correlation of the variable in the east-west direction, estimated by a leastsquares fit of an exponential decay function to the spatial correlogram (the sample correlation of the time series of the variable at a particular grid cell with that at other grid cells at the same latitude, as a function of distance between grid cells).



A useful way of thinking about the significance of a difference in a climate field between the CLIM run (with climatological soil moisture) and the DYNA run (with interactive soil moisture) is the chance that a small perturbation in the DYNA run that does not systematically modify the soil moisture feedback will lead to a difference of the same magnitude. The standard deviation across the ensemble of three successive 30-year runs, which share interactive soil moisture and the 1951–1980 sea surface temperature field but have different initial conditions, provided an estimate of the magnitude of this "random" variability. To estimate the statistical significance of differences between CLIM and DYNA, we further assumed that the random variability was normally distributed across model realizations. p=0.10 (two-tailed), corresponding to 3.6 standard deviations of the ensemble formed by the DYNA run and the two previous runs, was taken as the threshold for considering a difference between CLIM and DYNA to be a significant impact of soil moisture feedback.

Below, we discuss differences between runs primarily as averaged over the land ¹⁵ surface (model grid cells with at least 50% land fraction). Changes averaged over the ocean surface were all much smaller; we mention them when they are significant. We use maps to display the spatial distribution of some of the differences in detail. For seasonal quantities, the Tables show averages over the northern midlatitude land surface (15°–50° north) to preserve consistent seasonality.

20 3 Results: impact of soil moisture feedback on climate

3.1 Mean state

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Because of the nonlinearity of the dependence of evaporation rate on soil moisture, land-surface evaporation was 8% lower under interactive soil moisture as compared to climatological soil moisture (Table 1), with particularly large decreases in seasonally dry and semiarid tropical and midlatitude areas during summer and fall and in tropical Africa year-round (Fig. 1). Interestingly, evaporation from Siberia in spring *increased*,



because of warmer temperatures and faster snowmelt. Evaporation from the sea surface, which is limited by energy rather than water availability, increased slightly (0.2%), because the lower land evaporation decreased relative humidity and warmed the atmosphere, increasing the vapor pressure deficit near the surface. Globally, evaporation decreased 1%.

Since the atmosphere does not store much water, global precipitation decreased by practically the same amount as evaporation (5% decrease over land; 0.2% increase over ocean) (Table 1). Precipitation decreases were collocated with and tended to extend some hundred km downwind (mostly east) of evaporation decreases, reflecting the characteristic length scale for modeled (and observed) water vapor transport and condensation (Trenberth, 1998) (Fig. 2). Precipitation decreases over midlatitude land were limited to the spring and summer, but precipitation decreased in all seasons over the equatorial rain forests of South America, Africa, and Indonesia. A major exception

to the decrease in precipitation over land was found in India, where summer rainfall ¹⁵ increased substantially (stronger summer monsoon). Inferred runoff (land precipitation minus land evaporation), or water vapor transport onto land, remained almost constant on average. Thus, the decrease in precipitation can be conceptualized as a direct consequence of less evaporation over land (lower precipitation recycling), rather than decreased transport of water vapor from the ocean.

²⁰ The reduced evaporation increased surface temperature over land by 0.2 K (Table 1), concentrated over the same areas and seasons for which evaporation decreased, for which warming ranged above 2 K (Fig. 3).

Cloud fraction decreased by 0.2% over land, concentrated during spring and summer, for which regional decreases were in the 1% range (Fig. 4). Changes in cloudi-²⁵ ness were less likely to be significant on a grid-cell basis than for precipitation and temperature. India was cooler and cloudier in summer (along with more evaporation and precipitation), reflecting a more intense monsoon, though warmer and less cloudy (along with less evaporation and precipitation) in spring. The greater land-sea temperature gradient during spring could plausibly have lead to a stronger summer monsoon.

HESSD 6, 6967-6999, 2009 Soil moisture and climate Krakauer et al. **Title Page** Abstract Introduction Conclusions References **Figures** Tables Back Close Full Screen / Esc **Printer-friendly Version** Interactive Discussion

To illustrate the complexity of seasonally specific mean climate changes seen, Fig. 5 shows the change in monthly mean climate for four representative land grid cells. In the gridcell in the US Great Plains (40° N, 99° W), evaporation is 20–50% lower in the DYNA run as compared to the CLIM run from June through October. Precipitation in

- the DYNA run is already lower in May, presumably because of the advection of moisture anomalies from other grid cells where evaporation is affected in May. Temperatures are 1–3 K higher for June to October, but cloudiness does not show a consistent change. In the gridcell in eastern Europe near the Urals (47° N, 44° E), evaporation is strongly suppressed (and cloud fraction reduced by around 5%) on August and September
 but precipitation already decreases, and surface temperatures increase, in July. The
 - maximum warming is 5 K, in August.

In the gridcell in the western Sahel (17° N, 1° E), precipitation is lower from the beginning to the peak of the wet season (April to August), as is cloud fraction. Evaporation is lower at the end of the wet season (August to October), and it is somewhat warmer (up

to 1 K) all year round. In the gridcell in the Amazon (9° S, 61° W), evaporation declines most strongly at the height of the dry season (August), but precipitation declines most strongly at the height of the wet season (February and March). Warming is greatest (0.5–1 K) in August and September, while cloud fraction does not show a consistent change.

20 3.2 Interannual variability

Interactive soil moisture more than doubled the mean interannual standard deviation of land evaporation, illustrating that moisture availability is the major control of land evaporation. Variability in evaporation increased over all seasons, but most in summer and fall (Fig. 6). Temperature variability in the summer extratropics and year-round in ²⁵ the tropics showed a large increase of some 50% (Fig. 7), suggesting, as also found in previous studies, that through its control on the fraction of incident energy used for evaporation, soil moisture is an important contributor to summer heat waves. Particularly large increases in temperature variance are induced in austral summer in inland



Australia (Fig. 7a), in austral fall in southern Africa (Fig. 7b), and in boreal summer in North America's Great Plains and in eastern Europe and western Siberia (Fig. 7c). Variability in land precipitation and cloudiness also increased in the summer and fall (Table 1), but this increase was mostly less significant for individual grid cells (not shown).

3.3 Time correlation

Time correlation measures the length of, for example, wet and dry spells at a given spot. In both the model and in observed climate, correlation between consecutive years in precipitation and cloudiness is very weak over most of the earth's surface, while correlation in temperature and evaporation is somewhat stronger, driven by slowly varying patterns of SST anomalies (Table 2). The autocorrelation of annual evaporation decreases as a result of soil moisture feedback, because evaporation now depends, via soil moisture, on precipitation (which varies more rapidly) more than on temperature (which varies more slowly). By contrast, soil moisture feedback increases the shorter-term correlation between spring and summer and between summer and fall for temperature and evaporation, as soil moisture provides a seasonal-scale "memory" that propagates wet-cool or dry-hot patterns during the warm half of the year (Table 2). Soil moisture feedback *decreases* the correlation between fall and winter precipitation, perhaps because fall precipitation now depends more on soil moisture whereas winter

- 20 precipitation still depends only on basically unrelated variations in large-scale circulation (Table 2). At the grid-cell level changes in the inter-seasonal correlation of climate variables were mostly not significant, but noteworthy regional impacts include an increase in the correlation of fall with winter evaporation in southern Africa (wet-season moisture anomalies persisting into the dry season) and an increase in the correlation
- ²⁵ of spring with summer temperature in much of the central and western United States (not shown).

HESSD 6, 6967-6999, 2009 Soil moisture and climate Krakauer et al. **Title Page** Abstract Introduction Conclusions References **Figures** Tables 14 Back Close Full Screen / Esc **Printer-friendly Version** Interactive Discussion

3.4 Space correlation

The correlation length provides an indication of the spatial extent of annual or seasonal scale climate anomalies (for example, the typical spatial extent of a drought). The mean correlation length for annual temperature (~5000 km) is much longer than

that for annual precipitation or cloudiness (~800 km) (Table 2). This is in part because temperature variability is largely determined by interannual sea-surface temperature patterns with large spatial scale, while these patterns are less influential for precipitation and cloudiness variability. The correlation length of annual evaporation is smaller yet (~500 km), perhaps because small-scale variation in soil texture, topography, and land cover modulates the response of evaporation to variations in precipitation.

Soil moisture feedback tends to decrease the correlation length of evaporation because it makes evaporation strongly dependent on recent precipitation (short correlation length) as well as temperature (long correlation length); the decrease is regionally significant over North America, east Asia, and the Amazon basin (Fig. 8), although the

- global average does not show a significant difference (Table 2). Soil moisture feedback might be expected to increase the correlation length scale of precipitation on seasonal time scales because it makes precipitation dependent on earlier upwind precipitation. Indeed, the correlation length of seasonal precipitation does increase in summer (Table 2).
- Soil moisture feedback decreases the correlation length of temperature over land dramatically (by 19% (Table 2); by 4% over ocean), because temperature variability now depends on precipitation and soil moisture (with much smaller scales of variability) via the greatly enhanced variability in land evaporation. In fact, the correlation length of temperature over land is modeled to be more than that over ocean without soil moisture
- feedback, but less than that over ocean with soil moisture feedback (not shown). The correlation length of seasonal temperature decreases in fall (Table 2), reflecting the coupling of temperature and precipitation variability induced by soil moisture feedback, primarily over North America (Fig. 9). In the tropics, the temparture correlation length

HESSD								
6, 6967–6999, 2009								
Soil moisture and climate Krakauer et al.								
Title Page								
Abstract	Introduction							
Conclusions	References							
Tables	Tables Figures							
14	►I							
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Back	Close							
Full Scre	Full Screen / Esc							
Printer-friendly Version								
Interactive Discussion								

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scale tends to decrease year-round (Fig. 9). The role of soil moisture feedback in coupling temperature and precipitation can also be seen from the correlation between seasonal temperature and precipitation, which over land becomes substantially more negative as a result of soil moisture feedback (Fig. 10).

5 4 Discussion

4.1 Global and regional impacts of soil moisture feedback

We have used several metrics to summarize how soil moisture feedback affects climate on a planetary scale, reaching conclusions broadly consistent with those of many previous case studies and forecasting experiments. Soil moisture feedback makes annual and seasonal (warm-season) land evaporation, precipitation, temperature, and cloudiness substantially more variable. It introduces persistence of cool-wet or hot-dry conditions from spring through fall. This would be expected to have important impacts on land ecosystems, particularly in water-limited areas, and dynamic vegetation responses (not modeled here) would be expected to amplify climate perturbations further compared to a hypothetical condition of no vegetation and low soil moisture capacity, so that there could even exist two fundamentally different possible equilibrium climate states (vegetated-wet or barren-dry; Baudena et al., 2008).

Impacts over the ocean from soil moisture feedback are expected to be smaller and less direct than over land, but are underestimated here because the ocean state was

- prescribed rather than allowed to evolve in response to atmospheric forcing. A long integration time with coupled atmosphere and ocean would be necessary to properly quantify the two-way interaction of soil moisture and sea surface temperature in affecting climate variability. Abbot and Emanuel (2007) demonstrate that such feedbacks can be important in an idealized few-box model of atmosphere-sea-land interaction.
- ²⁵ The change in the mean evaporation rate and climate state between the climatological and interactive soil moisture runs is largely the opposite of that seen in the runs



reported by Reale and Dirmeyer (2002). In their simulations, dynamic, as compared with climatological, soil moisture resulted in higher land evaporation and precipitation (and lower ocean evaporation and precipitation), whereas in our simulations land evaporation and precipitation substantially decreased (while ocean evaporation and precipitation)

- itation slightly increased). This can be qualitatively understood in terms of the different strategies we used to set climatological soil moisture. Whereas here we set soil moisture for each month to its climatology, Reale and Dirmeyer (2002) instead prescribed a climatology of the "evaporation factor" (actual evapotranspiration, summed over a month, as a fraction of potential evapotranspiration). The nonlinearity of evaporation
- as a function of state variables such as soil moisture and temperature means that these two approaches bias land evaporation rate in opposite senses. At moderate soil moisture content, the increase of evaporation with soil moisture has negative curvature (is concave), so prescribing average soil moisture results in higher than average evaporation. On the other hand, the evaporation factor is higher than climatology at night and
- ¹⁵ under cool conditions, and lower than climatology under hot, dry conditions. Prescribing it to be constant leads to high evaporation in hot, dry conditions, which reduces otherwise high vapor pressure deficits and thus cuts potential evapotranspiration. Since the actual evapotranspiration is a prescribed fraction of potential evapotranspiration, the former is also reduced.
- The observed changes in the mean climate are therefore dependent on the specific climatology adopted for soil moisture and/or evaporation and do not result from the difference between dynamic and climatological soil moisture as such. This introduces some ambiguity into interpreting model experiments such as the one reported here. Unlike the changes in the mean climate state, the changes in climate variability (for example, higher interannual variance of precipitation with dynamic soil moisture) re-
- ported by Reale and Dirmeyer (2002) were similar to those we found, which suggests that these changes can be more confidently interpreted as an effect of dynamic soil moisture as such. If so, analysis of the space and time scales of observed climate variability could potentially help quantify the actual strength of soil moisture feedback

HESSD								
6, 6967–6999, 2009								
Soil moisture and climate								
Krakauer et al.								
Title Page								
Abstract	Introduction							
Conclusions	References							
Tables	Figures							
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Back	Close							
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and determine which models represent it most accurately.

The substantial change observed in the mean state, especially in summer temperature and precipitation, is interesting in that our formulation of interannually fixed soil moisture can be thought similar to high soil water capacity (which would also lead to

- reduced synoptic and interannual variability in volumetric soil moisture). The impact on land climate of changing soil water capacity, whether over evolutionary time as plants and soils shift or in historic time as a result of deforestation and tillage, would be an intriguing target for future research.
- In these model integrations, soil moisture, and hence evaporation, perturbations were reflected in local temperature change (from surface evaporative cooling) and downwind precipitation change. The precise length/time scale over which precipitation responds to additional evaporation depends on subgrid condensation processes and therefore varies substantially among current global models (Koster et al., 2004). While this limitation may not affect the global-scale results very much, regional models where convection is either more explicitly resolved or whose parameterization has been validated in detail would be recommended for studying the impacts of regional changes in soil moisture, for example from irrigation or no-till agriculture, at better resolution.

4.2 Soil moisture feedback and interannual persistence

We were not able to show a significant impact of soil moisture feedback on the year-toyear persistence of precipitation or other climate variables. The year-to-year autocorrelations of climate variables tend to be low, and a longer period than 30 years may be necessary to detect a significant difference in interannual persistence. Schubert et al. (2004) found that 50-year periods in a 200-year run do not show consistent year-toyear persistence of precipitation and soil moisture in the Great Plains, although their full run does.

An additional factor affecting soil moisture feedback in our and most previous global modeling efforts is that the model soil depth is no more than 3.5 m, limiting the effective water capacity of the soil and hence the time over which it integrates precipitation



history. In fact, soils can be many meters deep, and the root systems of trees and grasses are known to access water from deep in the soil profile (Stone and Kalisz, 1991; Richter and Markowitz, 1995; Kleidon and Heimann, 1998). This has been studied most thoroughly in seasonally dry Amazon rainforest, where trees are found to access water down to at least 10 m depth, enabling high rates of evapotranspiration and

- ⁵ cess water down to at least 10 m depth, enabling high rates of evapotranspiration and photosynthesis to continue through dry seasons and drought years (Nepstad et al., 1994; da Rocha et al., 2004; Huete et al., 2006). Water stored within trees can also be important in seasonally dry tropical forest (Borchert, 1994), as can hydraulic redistribution (active vertical transport of water within the soil profile by plant roots) (Oliveira
- et al., 2005). Model simulations with deeper soil, an explicit water table (Maxwell et al., 2007), and representation of hydraulic redistribution (Lee et al., 2005) and plant water storage should be able to better resolve the role of soil moisture feedback in long-term variability.

5 Conclusions

We have shown how soil moisture feedback affects planetary climate in a general circulation model simulation. Soil moisture feedback makes a large contribution to variability in temperature, precipitation, and cloudiness across warm seasons. Analysis of space and time scales of climate variables further elucidates how soil moisture feedback induces cool-wet and hot-dry seasonal patterns. Longer runs and more realistic treatment of deep soil and groundwater are required to evaluate the contribution of soil moisture feedback to interannual variability, such as multiyear droughts. The soil moisture feedback impacts found here provide new targets for comparisons across models and with observations.

Acknowledgement. This study was supported by the National Oceanic and Atmospheric Ad ²⁵ ministration (NOAA) under Grant Number NA06OAR4810162. The statements contained in this article are not the opinions of the funding agency or the US government, but reflect the views of the authors.



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HESSD								
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Soil moisture and climate Krakauer et al.								
Title Page								
Abstract	Introduction							
Conclusions	References							
Tables	Figures							
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•	F							
Back	Close							
Full Scre	Full Screen / Esc							
Printer-friendly Version								
Interactive Discussion								



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HESSD								
Soil moisture and								
climate Krakauer et al.								
Title Page								
Abstract	Introduction							
Conclusions	References							
Tables	Figures							
14								
•	•							
Back	Close							
Full Screen / Esc								
Printer-friendly Version								
Interactive Discussion								

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HESSD								
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Soil moisture and climate								
Krakauer et al.								
Title I	Page							
Abstract	Introduction							
Conclusions	References							
Tables	Figures							
I	►I							
•	•							
Back	Close							
Full Scre	en / Esc							
Printer-friendly Version								
Interactive Discussion								

BY

6, 6967–6999, 2009

Soil moisture and climate

Krakauer et al.

Title Page									
Abstract	Introduction								
Conclusions	References								
Tables	Figures								
•	•								
Back	Close								
Full Screen / Esc									
Printer-friendly Version									
Interactive Discussion									

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Table 1. Impact of dynamic soil moisture on the mean and variance of climate quantities over land.

	Evapor CLIM	ration (mr DYNA	n/day)	Precipi CLIM	tation (m DYNA	m/day)	Tempe CLIM	rature (° DYNA	C)	Cloudin CLIM	ess (%) DYNA	
Annual mean	1.67	1.53	***	2.66	2.53	***	9.78	10.03	***	59.1	58.9	**
Interannual SD ^a	0.060	0.125	***	0.166	0.182	*	0.51	0.57	**	0.0505	0.0542	*
Seasonal standa	rd deviat	ion:										
winter	0.174	0.313	***	0.571	0.611		1.11	1.12		0.165	0.168	
spring	0.155	0.309	***	0.476	0.503		0.83	0.94		0.146	0.144	
summer	0.124	0.308	***	0.389	0.481	**	0.56	0.87	***	0.155	0.165	*
fall	0.114	0.289	***	0.392	0.424	*	0.70	0.83	***	0.131	0.139	*

Significance level of differences between runs: *0.1, **0.05, ***0.01 (two-tailed).

^a Standard deviation is dimensionless (normalized by the mean), except for temperature where it is in K.

6, 6967-6999, 2009

Soil moisture and climate

Krakauer et al.





Table 2. Impact of dynamic soil moisture on the space and time correlation of climate quantities over land.

	Evapo CLIM	ration DYNA	L	Precipitation CLIM DYNA		Temperature CLIM DYNA			Cloudi CLIM	ness DYNA	
Interannual auto	correlati	on time	sca	le (y)							
	0.47	0.41	*	0.27	0.28		0.44	0.42		0.30	0.30
3-month autocor	relation										
winter-spring	0.02	0.04		0.00	0.02		0.02	0.01		0.01	0.03
spring-summer	0.07	0.16	*	0.03	0.10		0.07	0.18	***	0.04	0.10
summer-fall	0.08	0.19	**	0.03	0.10		0.13	0.16	*	0.02	0.13
fall-winter	0.01	0.02		0.04	0.00	*	0.00	-0.01		0.03	0.02
annual correlation length (km)											
	562	514		742	848		5994	4840	***	860	884
seasonal correla	tion leng	gth (km))								
winter	578	683		858	901		2192	2163		1291	1205
spring	549	518		752	836		1980	1644		970	1133
summer	577	636		893	1065	**	1895	1683		845	877
fall	516	583		713	824		1889	1428	**	905	881

Significance level of differences between runs: *0.1, **0.05, ***0.01 (two-tailed).



Fig. 1. Change in seasonal evaporation (mm/day) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON. In this and subsequent figures, increases are shown as orange to red, decreases as green to blue; only changes that are over land and are significant at the 0.1 level are shown.







Fig. 2. Change in seasonal precipitation (mm/day) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON.







Fig. 3. Change in seasonal temperature (K) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON.

Fig. 5. Monthly mean climate for four representative grid points: **(a)** US Great Plains (40° N 99° W), **(b)** eastern Europe (47° N 44° E), **(c)** the Sahel (17° N 1° E), **(d)** the Amazon basin (9° S 61° W). Columns show evaporation (mm/day), precipitation (mm/day), temperature (° C), and cloud fraction (%). Blue lines are from CLIM run, green lines DYNA run.

Fig. 6. Change in interannual coefficient of variation of seasonal evaporation (unitless) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON.

Fig. 7. Change in interannual standard deviation of seasonal temperature (K) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON.

6, 6967–6999, 2009

Fig. 8. Change in east-west correlation length scale for seasonal evaporation (km) induced by soil moisture feedback (DYNA minus CLIM run). (a) DJF, (b) MAM, (c) JJA, (d) SON.

Krakauer et al.

Fig. 9. Change in east-west correlation length scale for seasonal temperature (km) induced by soil moisture feedback. (a) DJF, (b) MAM, (c) JJA, (d) SON.

Fig. 10. Change in correlation coefficient between seasonal temperature and precipitation (dimensionless) induced by soil moisture feedback (DYNA minus CLIM run). Negative values mean that the correlation coefficient (r) became more negative, not that the strength of the correlation (r^2) was reduced. (a) DJF, (b) MAM, (c) JJA, (d) SON.

