Testing gridded NWS 1-day observed precipitation analysis in a daily irrigation scheduler

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Received 1 October 2013; revised 2 November 2013; accepted 16 November 2013

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ABSTRACT

One of the inputs required by daily decision support tools for scheduling irrigation is the amount of water supplied by rainfall. In-field measurements of daily precipitation are expensive or laborious, while measurements from gauges within a few kilometers are frequently not representative due to the high spatiotemporal variability of precipitation. Online radarbased precipitation analyses from NOAA's National Weather Service (NWS) have obvious potential to provide the needed data, but are known to have varying degrees of accuracy with location and conditions. The NWS precipitation analysis is computed on a 4 km × 4 km grid, so differences should also be expected between the product and individual gauge measurements under each grid cell. In order to test the utility of the NWS precipitation analysis in a daily irrigation scheduler, daily data were gathered in July 2012 from 18 weather stations under 2 NWS precapitation analysis grid cells across instrumented research and production fields in the Mississippi Delta. Differences between individual station measurements and the NWS precipitation analysis are examined, and root-zone daily soil water deficits computed using both station data and the NWS precipitation analysis. Sub-grid spatial variability between gauge locations, and differences in precipitation between gauges and the gridded NWS analysis, are found to be similar to those reported elsewhere. Differences between time series of soil water deficit computed using the two different precipitation data sources are noted, but prove to be of limited impact on the decision to irrigate or not to irrigate. It is also noted that profile-filling rainfalls limit the impact of accumulating error, resetting the modeled soil water to "full". Given the Delta-local practice of irrigating to replace full evapotranspirational water used, use of the NWS daily precipitation analysis data as input for a daily irrigation scheduler is judged not only acceptable, but also preferable to other sources of daily precipitation data.

Keywords: Irrigation; Daily; Precipitation; Scheduler; Gridded; Radar

1. INTRODUCTION

Mississippi currently enjoys plentiful ground water resources and rainfall in excess of 1 m per year. However, producers are increasingly reliant on supplemental irrigation to improve yields and profits [1]. This has resulted in a greater use of ground water, and a noted decline in the Mississippi River Valley alluvial aquifer of 300,000 acre feet of water per year for the past 10 years [2]. In neighboring states, serious groundwater depletion threatens future cropping options [3].

Water conservation efforts in Mississippi are nascent, as producers become increasingly aware of the need for good water management. Increasing volatility in recent weather patterns has resulted in little change in overall rainfall amounts, but a decrease in the number of events

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and a concomitant increase in intensity [4]. These changes in rainfall patterns decrease the amount of water that enters the soil profile. Moreover, the uncertainty of amount and timing of rainfall makes irrigation scheduling a particular challenge, as a high rainfall event immediately following irrigation can result in waterlogging of the soils that impedes crop growth. The challenge for Mississippi producers is to manage water resources appropriately, and to provide sufficient water for crop production through droughty periods of a few weeks that occur during the summer growing season.

While less efficient than sprinkler application, surface (furrow) irrigation accounts for nearly 70% of the irrigated acres in the Delta region [5]. Irrigation scheduling tools of any kind have not been widely adopted by producers for a variety of reasons. To improve water management, efforts have been underway to develop an easy to use, readily accessible irrigation scheduling tool for producers [6]. The Mississippi Irrigation Scheduling Tool, MIST, uses a water balance model to determine the cumulative soil water balance by summing the previous day's soil water, less that lost through evapotranspiration, plus rainfall or irrigation [7,8]. As with all model predictions, the accuracy of the MIST guidance is dependent on the accuracy of the inputs.

Precipitation is a key input for the water balance equation. Rainfall data is available from a wide range of sources in Mississippi, although the accuracy, spatial representativeness, and accessibility of the data are extremely limited [9]. To complicate the situation, the "typical" weather patterns of the humid southeast US commonly generate rainfall events that are highly varied spatially and temporally—ranging from high-intensity, rapidly moving storms, to slow stationary fronts. Anecdotal stories abound of farmers standing in sunshine on one side of the turn row, while heavy rain is received in the field across the turn row. As a result of this variability, knowing how much rain fell a few kilometers away tells a producer nothing about how much rain actually fell on local fields on any given day.

Management of large farms in the Mississippi Delta limits the time that producers have for data collection and processing. Field-specific precipitation measurements for use in any irrigation-scheduling tool such as MIST would be clearly preferred. However, producers in the Delta have indicated an aversion to having a rain gauge in every field for measuring field-specific rainfall, and to any requirement to gather and enter such information into an irrigation scheduling tool. As a result, the MIST was designed to run on automated inputs from national and regional databases of soil and weather information [7,8,10-12]. This automated downloading significantly reduces the time spent by farmers in data collection and importation to the model, and is expected to

enhance adoption and use of MIST.

The National Weather Service (NWS) has developed rainfall estimates based on radar and rain gauge data that are readily available and increasingly accurate [11-14]. This gridded precipitation analysis (termed 1-Day Observed Precipitation Analysis on their web site, hereafter NWS-PA) is used extensively for hydrologic and modeling studies in both the operational and research communities, and is essentially an estimate of the average precipitation falling across each grid cell. The accuracy of NWS-PA in comparison to ground-based measurements of rainfall has been tested in several circumstances, both within the grid scale of the precipitation analysis (nominally $4 \text{ km} \times 4 \text{ km}$) [13], and for areas larger than the grid scale [14]. While the reported biases were rather small for data aggregated over years, differences in daily precipitation between NWS-PA values (termed MPE in [13]) and observed precipitation (averaged over 4 rain gauges) were reported to be as large as 2.0 - 2.5 cm/day, albeit improving over successive years (2004-2006) as the algorithms were updated [13].

Beyond the question of accuracy of the NWS-PA product, each NWS-PA 4 km × 4 km grid cell covers an area of approximately 1600 ha. With an estimated average field size of 60 ha in Mississippi, each grid cell then covers approximately 27 fields. Given the spatially variable nature of rainfall, there will necessarily be differences between the NWS-PA and the amount that actually falls on any specific field. The question addressed in this research is one of degree: how severely will the net differences (due both to inaccuracy and spatial variability) between the NWS-PA and in-field gauge-measured precipitation impact the calculated soil water balance, and the subsequent "irrigate" or "not-irrigate" decision? In short, will use of the NWS-PA in MIST produce incorrect guidance?

The results of this analysis of the use of NWS-PA in an irrigation scheduler for the Mississippi Delta are expected to be relevant to irrigation scheduling in all humid, high-rainfall areas in the US during the summer growing season.

2. DATA AND METHODS

The most critical weather period for crop producers in the Mississippi Delta is May through mid-August. July is both in a critical period of the irrigation season in Mississippi, and a month when precipitation is primarily convective in origin (adding to the expected error [13]), so this is both a stiff and relevant test. Daily NWS-PA data were downloaded for two grid locations near Stoneville, MS for each day during the month of July in 2012 [12]. The spatial position of the NWS-PA was assigned to two centroid locations, and two 4 km × 4 km grids arranged around each point (**Figure 1**). Nine sampling



Figure 1. Sampling position of NWS-PA 4 km \times 4 km grid cells near Stoneville, MS (lower left corner of image), with grid centroids (pink balloons), and rain gauge locations (yellow balloons) and enumeration indicated.

locations were established within each grid for collection of rainfall data for a total of 18 sampling locations. StratusTM RG202 cm rain gauges (Fergus Falls, MN) were placed on 0.6 m posts at locations evenly dispersed throughout each grid, with placement chosen to give a good representative coverage of the study area. Gauge positions were adjusted as needed to accommodate land use, crops and structures, and to ensure access following a heavy rainfall. The resulting 9 gauges per NWS-PA grid cell was denser sampling than that used by [13], where there were 4 gauges within each cell. Each rain gauge spatial position was recorded, and together with daily rainfall was transferred to data analysis software for analysis. Rain gauges were read between 6 and 8 am each day to coincide with the NWS-PA [11].

Daily soil water balance was calculated using MIST [7, 8,10]. Water use is determined in MIST using the standard Penman-Monteith equation to calculate reference evapotranspiration (ET_o) from daily measurements of maximum and minimum temperature, solar radiation, wind speed, and relative humidity. The daily crop evapotranspiration (ET_c) is then calculated by multiplying ET_o by a crop-specific coefficient [15]. The daily soil water balance, WB_t , the water available in the soil for plant uptake, was calculated for each day over the month as:

$$WB_{t} = WB_{v} - ET_{c} + Rain_{u} + Irr$$
 (1)

where WB_y is the soil water balance yesterday; ET_c is the daily crop evapotranspiration; $Rain_u$ is crop-usable fraction of rainfall; and Irr is the amount of irrigation water applied.

3. RESULTS

After assessing the data quality of the field observa-

tions, and frequency of rain events during July 2012, it was decided to continue with subsequent analysis. This single month of data is not sufficient to reach any conclusions relative to the quality or representativeness of the NWS-PA data. Instead, our focus is on checking whether the gauge and NWS-PA data are consistent with results from more substantive studies in the region, then subsequently on assessing the impacts of using the NWS-PA data as a substitute for daily in-field rain gauge data in MIST.

As expected, substantial spatial variability in precipitation was observed between rain gauge locations. **Figure 2** shows daily total precipitation from each rain gauge from 5 of the rainy days in July 2012, plotted separately for the two grid cells. Gauge-measured precipitation varied across locations within a grid cell by as little as 1.0 cm, to as much as 3.74 cm (on July 11). The spread across gauges in total rainfall on July 11 appears to have been the result of one or more small but heavily precipitating storms, and is an example of the spatial scale issues associated with convective precipitation that prompted this study. Such conditions can lead to relatively large errors in NWS-PA [13], and may explain the relatively small NWS-PA values for July 11, 2012 over these two cells.

Note that while some of the gauge-measured values were centered around the NWS-PA value, other rain events were markedly offset in magnitude. The amount of variation between gauge measurements was not consistent between events, and did not depend on amount of rain received.

To determine if any obvious spatial or directional bias existed during July 2012 between the gauge-measured and NWS-PA rainfall amounts within these two grid cells, linear distance from the grid centroid and angular direction from the grid centroid (north = 0) were determined for each rain gauge location. Differences between gauge-measured and NWS-PA rainfall amounts for each of seven consecutive days (including those shown in **Figure 2**) are plotted against linear distance and angular direction from the two centroids in **Figure 3**. With the exception of July 11, there are no obvious net biases with either distance or direction from grid centroid across these seven days.

In a few cases, precipitation on the following day would compensate for a discrepancy between NWS-PA and gauge-measured precipitation in one-day totals. To check whether the differences were exacerbated or canceled over several weeks, the cumulative rainfall differences were determined for the entire month (**Figure 4**). The magnitude of differences in cumulative rainfall received for the month of July ranged from 0.25 to 3.00 cm, indicating that the differences do tend to cancel out over time. It is also clear from **Figures 2**, **3**, and **4** that the

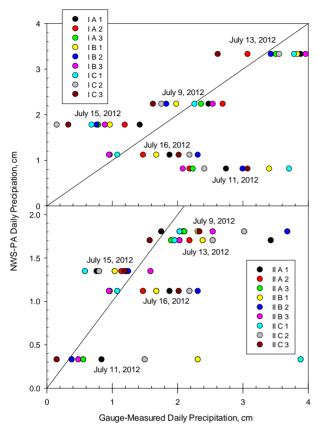
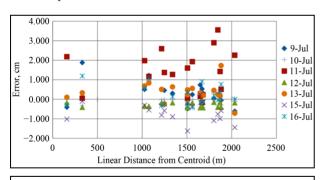


Figure 2. Comparison of daily total gauge-measured versus NWS-PA precipitation under two grid cells near Stoneville, MS for 5 rainy days in July 2012. Lines on each plot indicate 1:1 correspondence.



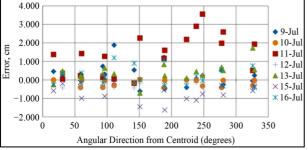
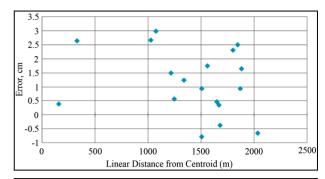


Figure 3. Error is calculated as the difference between the gauge-measurement and the NWS-PA, where a positive difference indicates that NWS-PA was smaller than gauge-measured daily precipitation.



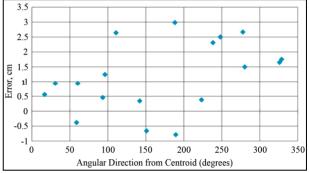


Figure 4. Error calculated in the same manner as in **Figure 3**, but for the total rainfall reported for July 2012.

NWS-PA totals tended to be smaller than the gauge totals, a result that is again consistent with previous results [13]. However, no spatial dependence on direction or distance from grid centroid is observed for this single month. In summary, both the NWS-PA and rain gauge data display the expected characteristics.

To assess the net impact of using NWS-PA as input for MIST, the model was run for each rain gauge location, adjusted for specific crop (e.g., corn or soybeans) and planting date using both the gauge measurements of precipitation and the NWS-PA for the encompassing grid cell. Daily time series of soil water deficit for each of the 18 locations were generated; examples of the best and worst match between modeled soil water deficits are presented for each of the two grid cells in **Figure 5**.

Somewhat surprisingly, although a substantial error existed between gauge-measured and NWS-PA precipitation on some days at some sites, there was limited impact on the MIST-modeled soil water deficit. The worst modeled single-day difference was on July 11 at gauge II C1, with a difference of 2.6 cm in soil water deficit (fourth panel in **Figure 5**). The best match (smallest maximum difference on any single day) was at II A3 (third panel in **Figure 5**). For all other sites, the maximum one-day difference in modeled soil water deficit ranged between 0.5 and 2.0 cm, with all of the maximum errors for grid cell I occurring on July 11. For grid cell II, the dates for maximum difference occurred during July 9-13.

Despite these differences, at only one of the locations (I C2) did the NWS-PA generated MIST output change

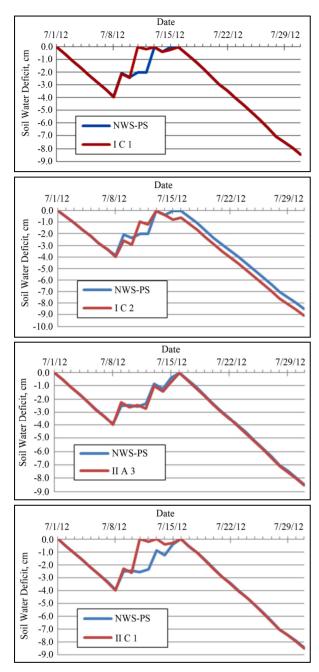


Figure 5. Time series of MIST predictions of daily soil water deficit in the rooting zone calculated with both the NWS-PA (blue line) and rain gauge measurements (red line) for 4 rain gauge locations.

the irrigation decision (on July 29), with a net result of only a one-day delay in irrigation. This lack of impact indicates that the precipitation errors were not sufficiently large to dominate the daily MIST calculations when the soil water column is partially filled. But more importantly, this study makes it clear that cumulative errors are removed from the running MIST calculations whenever sufficient rainfall refills the soil water column, effectively resetting the soil water balance to "full".

As a final check on the impacts of differences in the soil water deficit predictions by MIST due to use of NWS-PA instead of field-specific rain gauge data, the month-total cumulative soil water depletion was calculated for each site, for a variety of irrigated crops and crop stages prevalent in July in the Mississippi Delta. Corn typically has high transpiration during July, making significant demands on water within the rooting zone. Mid-(April) and late-planted (May) soybeans have relatively high transpiration rates, although not as great as corn. Early-planted soybeans are beginning to senesce in July, so exhibit sharply lower transpirational water demand. MIST predictions were also calculated using the daily average of all rain gauge measurements within each grid, a value expected to be close to the NWS-PA.

Figure 6 shows the month-cumulative differences for different crops and crop stages for two of the gauge locations (I C2 and II B1), as well as the grid-averaged gauge precipitation measurements. Site II B1 had one of the larger single day differences on July 11 (2.1 cm), so is included as an example of the impact of a large single-day error. And while Site I C2 had the single-day lowest modeled difference, it was also the one location where the MIST-calculated soil water deficit differences (about 0.7 cm) persisted until the end of the month throughout a dry-down period, producing the single error in irrigation guidance during this month-long test.

The monthly grid-averaged gauge totals closely track the NWS-PA totals. The month-totals for the two individual locations suggest that month-cumulative errors of less than 1.0 cm can be expected while using NWS-PA as input for MIST during summer months, less than 1/3 of

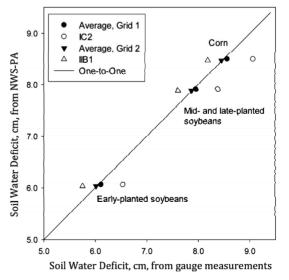


Figure 6. Comparison of soil water depletion for the entire month of July calculated with MIST using gauge measured precipitation, as well as grid-averaged gauge measurements, versus depletion calculated using NWS-PA.

the corresponding month-total precipitation differences.

4. CONCLUSIONS

Substitution of NWS-PA for in-field rain gauge data has less of an impact than expected on the daily soil water deficit calculations, as well as the associated irrigate/ no-irrigate guidance provided by MIST. Sub-grid spatiotemporal variability in July precipitation in Mississippi has a negative impact on the accuracy of NWS-PA relative to rain gauge readings, and on subsequent daily soil water deficit calculations, but the magnitude of the differences during the test period only changed the irrigate/ no-irrigate decision at one site (out of 18) on one day in the month of testing. It is also apparent that any rainfall or irrigation that refills the soil water profile (typical irrigation practice in Mississippi) resets the MIST calculations of soil water deficit to zero, removing any cumulative impact of use of NWS-PA instead of in-field rain gauge data.

Given the scarcity of readily accessible, quality-controlled, in-field rain gauge measurements, the NWS-PA is judged to be a viable, even preferable, alternative for use in MIST. This result should apply in all humid, high-rainfall areas of the US.

However, note that this result does not necessarily apply for farmers practicing deficit irrigation, in which the soil water profile is not completely replenished. Consideration of the size of the daily error in soil water deficit, due to use of NWS-PA, would need to be factored into the decision-making process of a deficit-irrigation scheduler. Consequently, use of MIST with NWS-PA input is not recommended for those practicing deficit irrigation until and unless further evaluation across several summers is conducted, similar to that reported here, and MIST is explicitly modified to include the results.

Given the success noted here, NWS-PA should be considered and tested as input for daily irrigation schedulers wherever NWS radar coverage is relatively complete (east of the Rocky Mountains, and western CA and WA), and in-field rain gauges are scarce. Simple adjustments in the algorithm for deciding whether or not to irrigate may be possible to limit any negative impacts from use of the NWS-PA data.

5. ACKNOWLEDGEMENTS

We thank the Mississippi Soybean Promotion Board and the Mississippi Corn Promotion Board for financial support for this research.

Contribution No. 14-109-J from the Kansas Agricultural Experiment Station

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