



The WACMOS-ET  
project – Part 2

D. G. Miralles et al.

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.

# The WACMOS-ET project – Part 2: Evaluation of global terrestrial evaporation data sets

D. G. Miralles<sup>1,2</sup>, C. Jiménez<sup>3</sup>, M. Jung<sup>4</sup>, D. Michel<sup>5</sup>, A. Ershadi<sup>6</sup>, M. F. McCabe<sup>6</sup>,  
M. Hirschi<sup>5</sup>, B. Martens<sup>2</sup>, A. J. Dolman<sup>1</sup>, J. B. Fisher<sup>7</sup>, Q. Mu<sup>8</sup>, S. I. Seneviratne<sup>5</sup>,  
E. F. Wood<sup>9</sup>, and D. Fernández-Prieto<sup>10</sup>

<sup>1</sup>Department of Earth Sciences, VU University Amsterdam, Amsterdam, the Netherlands

<sup>2</sup>Laboratory of Hydrology and Water Management, Ghent University, Ghent, Belgium

<sup>3</sup>Estellus, Paris, France

<sup>4</sup>Max Planck Institute for Biogeochemistry, Jena, Germany

<sup>5</sup>Institute for Atmospheric and Climate Science, ETH Zürich, Zürich, Switzerland

<sup>6</sup>Division of Biological and Environmental Sciences and Engineering, King Abdullah University of Science and Technology, Thuwal, Saudi Arabia

<sup>7</sup>Jet Propulsion Laboratory, California Institute of Technology, Pasadena, California, USA

<sup>8</sup>Department of Ecosystem and Conservation Sciences, University of Montana, Missoula, Montana, USA

<sup>9</sup>Department of Civil and Environmental Engineering, Princeton University, Princeton, New Jersey, USA

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



<sup>10</sup>ESRIN, European Space Agency, Frascati, Italy

Received: 1 October 2015 – Accepted: 5 October 2015 – Published: 19 October 2015

Correspondence to: D. G. Miralles (diego.miralles@VU.nl)

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

## HESSD

12, 10651–10700, 2015

### The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



## Abstract

The WACMOS-ET project aims to advance the development of land evaporation estimates at global and regional scales. Its main objective is the derivation, validation and inter-comparison of a group of existing evaporation retrieval algorithms driven by a common forcing data set. Three commonly used process-based evaporation methodologies are evaluated: the Penman–Monteith algorithm behind the official Moderate Resolution Imaging Spectroradiometer (MODIS) evaporation product (PM-MOD), the Global Land Evaporation Amsterdam Model (GLEAM), and the Priestley and Taylor Jet Propulsion Laboratory model (PT-JPL). The resulting global spatiotemporal variability of evaporation, the closure of regional water budgets and the discrete estimation of land evaporation components or sources (i.e. transpiration, interception loss and direct soil evaporation) are investigated using river discharge data, independent global evaporation data sets and results from previous studies. In a companion article (Part 1), Michel et al. (2015) inspect the performance of these three models at local scales using measurements from eddy-covariance towers, and include the assessment the Surface Energy Balance System (SEBS) model. In agreement with Part 1, our results here indicate that the Priestley and Taylor based products (PT-JPL and GLEAM) perform overall best for most ecosystems and climate regimes. While all three products adequately represent the expected average geographical patterns and seasonality, there is a tendency from PM-MOD to underestimate the flux in the tropics and subtropics. Overall, results from GLEAM and PT-JPL appear more realistic when compared against surface water balances from 837 globally-distributed catchments, and against separate evaporation estimates from ERA-Interim and the Model Tree Ensemble (MTE). Nonetheless, all products manifest large dissimilarities during conditions of water stress and drought, and deficiencies in the way evaporation is partitioned into its different components. This observed inter-product variability, even when common forcing is used, implies caution in applying a single data set for large-scale studies in isolation. A general finding that different models perform better under different conditions highlights the potential for

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)

[Abstract](#)

[Introduction](#)

[Conclusions](#)

[References](#)

[Tables](#)

[Figures](#)

[⏪](#)

[⏩](#)

[◀](#)

[▶](#)

[Back](#)

[Close](#)

[Full Screen / Esc](#)

[Printer-friendly Version](#)

[Interactive Discussion](#)



considering biome- or climate-specific composites of models. Yet, the generation of a multi-product ensemble, with weighting based on validation analyses and uncertainty assessments, is proposed as the best way forward in our long-term goal to develop a robust observational benchmark data set of continental evaporation.

## 1 Introduction

The importance of terrestrial evaporation (or “evapotranspiration”) for hydrology, agriculture and meteorology has long been recognized. As a matter of fact, most of our understanding of the physics of evaporation originated in early experiments during the past two centuries (e.g. Dalton, 1802; Horton, 1919; Penman, 1948). However, it has been during the last decade that the interest of the scientific community towards land evaporation has increased more dramatically, following the recognition of the key role it plays in climate (Wang and Dickinson, 2012; Dolman et al., 2014). Evaporation is highly sensitive to radiative forcing: changes in atmospheric chemical composition impact the magnitude of the flux, ensuring the propagation of anthropogenic forcing to all the components of the hydrological cycle (Wild and Liepert, 2010) and altering the global availability of water resources (Hagemann et al., 2014). In addition, evaporation regulates climate through a series of feedbacks acting on air temperature, humidity and precipitation (Koster et al., 2006; Seneviratne et al., 2010), thus affecting climate trends (Douville et al., 2012; Sheffield et al., 2012) and hydro-meteorological extremes (Seneviratne et al., 2006; Teuling et al., 2013; Miralles et al., 2014a). Finally, due to the link between transpiration and photosynthesis, atmospheric carbon concentrations and carbon cycle feedbacks are tightly linked to terrestrial evaporation (Reichstein et al., 2013). All together, evaporation stands as crucial nexus of processes and cycles in the climate system.

The rising interest of the climate community has coincided with an unprecedented availability of global observational data to scrutinize the response of evaporation to climate change impacts and feedbacks. However, due to the limitations in coverage

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

of direct in situ measurements, the scientific community have turned their eyes to-  
wards satellite remote sensing (Kalma et al., 2008; Wang and Dickinson, 2012; Dol-  
man et al., 2014). Consequently, different international activities now focus on the  
joint advancement of remote sensing technology and evaporation science, including  
the National Aeronautics and Space Administration (NASA) Energy and Water cycle  
Study (NEWS, <http://nasa-news.org>), the European Union WATER and global CHANGE  
(WATCH, <http://eu-watch.org>) project, and the Global Energy and Water-cycle EXper-  
iment (GEWEX) LandFlux initiative (<http://wgdma.giss.nasa.gov/landflux.html>). Despite  
continuing progress in the fields of remote sensing and computing science, up to date,  
the evaporative flux cannot be directly sensed from space; technology thus lags behind  
our physical knowledge of evaporation. Nonetheless, taking advantage of this existing  
knowledge, different models have been proposed to combine the physical variables that  
are linked to the evaporation process and can be observed from space (e.g. radiation,  
temperature, soil moisture or vegetation dynamics). Such efforts have yielded a num-  
ber of global evaporation products in recent years (Mu et al., 2007; Zhang et al., 2010;  
Fisher et al., 2008; Miralles et al., 2011b; Jung et al., 2010). These data sets are not to  
be interpreted as the direct result of satellite observations, but rather as model outputs  
generated based on satellite forcing data. The reader is directed to Su et al. (2011) or  
McCabe et al. (2013) for recent reviews of the state of the art.

Despite the recent initiatives dedicated to exploring these evaporation data sets –  
LandFlux-EVAL in particular, see Jimenez et al. (2011) and Mueller et al. (2011, 2013)  
– the relative merits from each model at the global scale remain largely unexplored. To  
date, the lack of inter-model consistency in the choice of forcing data has hampered  
the attribution of the observed skill of each evaporation data set to differences in the  
models. Only recently, some efforts have been directed to homogenising the forcing  
of these models to allow the assessment of algorithm quality (Vinukollu et al., 2010a;  
Ershadi et al., 2014; Chen et al., 2015; McCabe et al., 2015). The European Space  
Agency (ESA) Water Cycle Multi-mission Observation Strategy (WACMOS)-ET project  
(<http://WACMOSET.estellus.eu>) started in 2012 in response to the need for a thorough

**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[|◀](#)[▶|](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

an consistent model inter-comparison at different spatial and temporal scales, and targeting the long-term goal of GEWEX LandFlux of achieving global closure of surface water and energy budgets. The project objectives strive to (a) develop a reference input data set consisting of satellite observations, reanalysis data and in situ measured meteorology, (b) run a group of selected evaporation models forced by the reference input data set, and (c) perform a cross-comparison, evaluation and validation exercise of the evaporation data sets that result from running this group of models. Four algorithms that are commonly used by the research community have been tested: the Surface Energy Balance Model, SEBS (Su, 2001); the Penman–Monteith approach that sets the basis for the official Moderate Resolution Imaging Spectroradiometer (MODIS) evaporation product, hereafter referred to as PM-MOD (Mu et al., 2007, 2011, 2013); the Global Land Evaporation Amsterdam Model, GLEAM (Miralles et al., 2011a, b); and the Priestley and Taylor model from the Jet Propulsion Laboratory, PT-JPL (Fisher et al., 2008).

In a companion article – henceforth referred to as Part 1 – Michel et al. (2015) describe the results of the local validation activities of WACMOS-ET based on in situ evaporation measurements from eddy-covariance towers. Here, we present the global-scale inter-product evaluation. After forcing the models with the reference input data set (see Sect. 2.2 for the description of the forcing data), the resulting evaporation data sets are evaluated by means of: (a) a general exploration of the global magnitude and spatiotemporal variability of the estimates (Sects. 3.1 and 3.2), (b) a comparison to other, commonly-used, evaporation data sets (Sects. 3.1, 3.2 and 3.3), including the Model Tree Ensemble (MTE) estimates by Jung et al. (2009, 2010) and the European Centre for Medium-range Weather Forecasts (ECMWF) Re-Analysis (ERA)-Interim data (Dee et al., 2011), (c) an assessment of the skill to close the surface water balance over a broad range of catchments worldwide (Sect. 3.3), and (d) an analysis of the contribution to total terrestrial evaporation from the discrete components or sources of the flux, i.e. transpiration, interception loss and direct evaporation from the soil (Sect. 3.4). Due to thee difficulties that arise from executing SEBS at the global scale (see Su

et al., 2010), the current work concentrates on PM-MOD, GLEAM and PT-JPL, while the local-scale analysis in Part 1 also includes the SEBS model.

## 2 Methods and data

### 2.1 Models or algorithms

5 Here we present a brief description of the three models that are subjected to study in this article. For more exhaustive descriptions the reader is directed to Part 1 and to the original articles describing the parameterizations and algorithms from PM-MOD (Mu et al., 2007, 2011), GLEAM (Miralles et al., 2011b; Martens et al., 2015) and PT-JPL (Fisher et al., 2008). A summary of the forcing requirements of PM-MOD, GLEAM  
10 and PT-JPL can be found in Table 1, together with the specific product for each input variable.

#### 2.1.1 PM-MOD

The Penman–Monteith model by Mu et al. (2007, 2011) is arguably the most widely used remote sensing-based global evaporation product and, in its latest version, it  
15 is also the algorithm behind the official MODIS (MOD16) product (Mu et al., 2013). PM-MOD is based on the Monteith (1965) adaptation of Penman (1948), thus it is relatively high-demanding in terms of inputs. The parameterizations of aerodynamic and surface resistances for each component of evaporation are based on extending biome-specific conductance parameters to the canopy scale using vegetation phenology and meteorological data. The model applies the surface resistance scheme by Cleugh et al. (2007) – which uses leaf area index as suggested by Jarvis (1976) – in  
20 an extended version that considers the constraints of vapour pressure deficit and minimum temperature on stomatal conductance (Mu et al., 2007). However, in contrast to the majority of Penman–Monteith type of models, PM-MOD does not require soil moisture or wind speed data to parameterize the surface and aerodynamic resistances.  
25

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



The non-consideration of wind speed appears as an advantage when aiming for a fully observation-driven product. As opposed to GLEAM and PT-JPL, which do not require calibration, the resistance parameters in PM-MOD have been calibrated with data from a set of global eddy-covariance towers (see Mu et al., 2011).

### 2.1.2 GLEAM

GLEAM is a simple land surface model fully dedicated to deriving evaporation based on satellite forcing only (Miralles et al., 2011b). It distinguishes between direct soil evaporation, transpiration from short and tall vegetation, snow sublimation, open-water evaporation, and interception loss from tall vegetation. The latter is independently calculated based on the Gash (1979) analytical model for interception forced by observations of precipitation (Miralles et al., 2010). The remaining components of evaporation are based upon the formulation by Priestley and Taylor (1972), which does not require the parameterization of stomatal and aerodynamic resistances, in contrast to the Penman–Monteith equation. In the case of transpiration and soil evaporation, the potential evaporation estimates – resulting from the application of the Priestley and Taylor approach – are constrained by a multiplicative stress factor. This dynamic stress factor is calculated based on the content of water in vegetation (microwave vegetation optical depth; Liu et al., 2011) and root-zone (multi-layer soil model driven by observations of precipitation and microwave surface soil moisture). The consideration of vegetation water content accounts for the effects of plant phenology, while the root-zone soil moisture accounts for soil water stress. The model has been widely applied to look at trends in the water cycle (Miralles et al., 2014b) and land-atmospheric feedbacks (Guillod et al., 2015; Miralles et al., 2014a).

### 2.1.3 PT-JPL

The PT-JPL model by Fisher et al. (2008) uses the Priestley and Taylor (1972) approach to estimate potential evaporation. Unlike GLEAM, however, it applies a series of eco-

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion





**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

physiological stress factors based on atmospheric moisture (vapour pressure deficit and relative humidity) and vegetation indices (normalized difference vegetation index, i.e. NDVI, and soil adjusted vegetation index) to constrain the atmospheric demand for water. This implies that the set of forcing requirements are in fact very comparable to those of PM-MOD (see Table 1). In order to partition land evaporation into soil evaporation, transpiration and interception loss, PT-JPL first distributes the net radiation to the soil and vegetation components, and then calculates the potential evaporation for soil, transpiration and interception separately. The partitioning between transpiration and interception loss is done using a threshold based on relative humidity. The model has been employed in a number of studies to estimate terrestrial evaporation at regional and global scales in recent years (see e.g. Sahoo et al., 2011; Vinukollu et al., 2011a, b).

## 2.2 Input data

One of the objectives of the project has been to correct for a recurring issue in inter-product evaluations of global evaporation: due to inconsistencies in the forcing data behind current evaporation products, it is difficult to attribute the observed inter-product disagreements to algorithm discrepancies (Jiménez et al., 2011; Mueller et al., 2013). Consequently, one of the first steps in WACMOS-ET has been to compile a reference input data set that has been used to run all models in a consistent manner. This consistency applies to both local-scale runs (in Part 1), and regional and global runs (in the present study). On the other hand, since the required input variables are not the same for all models (see Table 1) – nor it is the models' sensitivity to these input variables and their uncertainties – it is not possible to fully attribute observed differences in performance to internal model errors. Nonetheless, our efforts to homogenize forcing data in a global evaporation inter-model comparison are unique, with the exception of Vinukollu et al. (2011a) that used off-the-shelf forcing data sets to run earlier versions of SEBS, PT-JPL and PM-Mu. For all the details in the production of the reference input data set the reader is directed to the thorough descriptions in Part 1 and the support

ing documents available in the project website. Nonetheless, a short summary is also provided here.

Some of the variables considered in the reference input data set have been internally generated during the project, while others were selected from the existing pool of global climatic and environmental data sets. Choices regarding the spatial and temporal resolution, period covered and study domain were made under the support of a large number of end users surveyed via internet (see project website). The targeted grid resolution of WACMOS-ET is 25 km, the domain is global and the study period spans 2005–2007. A 3 hourly temporal resolution maximizes the links to the work undertaken by the GEWEX LandFlux initiative to produce sub-daily evaporation estimates (McCabe et al., 2015). The present Part 2 evaluates the outputs after aggregating them to daily, monthly and annual scales, while the skill of the models to resolve the diurnal cycle of evaporation is explored in Part 1. Although the internally generated input data sets were originally derived at a relatively fine (< 5 km) resolution, critical inputs not generated within the project were only available at 75–100 km (see below). Consequently, all input data sets have been spatially resampled to match the 25 km targeted resolution and re-projected into a common sinusoidal grid before using them to run the evaporation models.

Internally developed products include the fraction of photosynthetically active radiation and leaf area index, which are derived to a large extent from European satellites (see Part 1). Data access, product descriptions and user guidelines for these data sets are available to interested parties upon request using the project website as gateway. Whereas PM-MOD and PT-JPL apply these internally generated data sets to characterize vegetation phenology, GLEAM uses observations of microwave optical depth as a proxy for vegetation water content, which is taken from the data set of Liu et al. (2011) at 0.25° spatial resolution based on the Advanced Microwave Scanning Radiometer-Earth Observing System (AMSR)-E.

The remaining products comprising the reference input data set have been selected from the pool of available community data sets. Surface net radiation comes from the

## HESSD

12, 10651–10700, 2015

### The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



# HESSD

12, 10651–10700, 2015

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[◀](#)[▶](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

NASA/GEWEX Surface Radiation Budget (SRB) Release 3.1, which contains global 3 hourly averages of surface longwave and shortwave radiative fluxes on a 1° resolution grid. The SRB product is based on a range of satellite data, atmospheric reanalysis and data assimilation (Stackhouse et al., 2004). The meteorology (i.e. near-surface air temperature, air humidity and wind speed) comes from the ERA-Interim atmospheric reanalysis, provided at 3 hourly resolution (using the forecast fields) and at a spatial resolution of ~ 75 km. The reason for using atmospheric reanalysis data (based on observations assimilated into a weather forecast model), as opposed to direct satellite observations, is that some of these variables are presently difficult to observe over continents (like air temperature and humidity), if not impossible (like wind speed), and are not routinely available at sub-daily time steps and over all weather conditions.

Despite its relevance for plant-available water and interception loss, precipitation is not a direct input for most global satellite-based evaporation models. The same applies to surface soil moisture, which can also be observed from space. From the WACMOS-ET models, only GLEAM uses observations of precipitation and surface soil moisture as input. In the reference input data set, precipitation data comes from the Climate Forecast System Reanalysis for Land (CFSR-Land, Coccia and Wood, 2015), which uses the Climate Prediction Center (CPC, Chen et al., 2008) and the Global Precipitation Climatology Project (GPCP, Huffman et al., 2001) daily data sets and applies a temporal downscaling based on the CFSR (Saha et al., 2010). For soil moisture, we use the satellite product of combined active-passive microwave surface soil moisture by Liu et al. (2012), which blends information from scatterometers and radiometers from different platforms, and was developed as part of the ESA Climate Change Initiative (CCI). In addition, GLEAM also uses information on snow water equivalents that is taken from the ESA GlobSnow product version 1.0 (Luoju and Pulliainen, 2010), based on AMSR-E and corrected using ground-based measurements. Since GlobSnow covers the Northern Hemisphere only, data from the National Snow and Ice Data Center (NSIDC) are used in snow-covered regions of the Southern Hemisphere (Kelly

et al., 2003). Observations of soil moisture and snow water equivalents have a native resolution of  $0.25^\circ$  and are imported in GLEAM at daily time steps.

## 2.3 Data used for evaluation

### 2.3.1 Other global land evaporation products

5 For the purpose of comparing our three WACMOS-ET products against related evaporation data sets, we incorporate two additional data sets into the evaluation: the ERA-Interim reanalysis evaporation (Dee et al., 2011) and the MTE product (Jung et al., 2010, 2009). The latter is derived from satellite data and FLUXNET observations (Bal-  
10 docchi et al., 2001) using a machine-learning algorithm. In the model, tree ensembles are trained to predict monthly eddy-covariance fluxes based on meteorological, climate and land cover data. It has a monthly temporal resolution and  $0.5^\circ$  spatial resolution. For full details, the reader is referred to Jung et al. (2009).

### 2.3.2 Catchment water balance data

15 The mass balance of a catchment implies that the space and time integration of precipitation ( $P$ ) minus river runoff ( $Q$ ) should equal evaporation (integrated over the same space and time). This requires the consideration of a long period, so changes in storage within the catchment and travel time of precipitation through the landscape can be neglected (see discussion in Sect. 3.3). Given that river runoff and precipitation are more easily and extensively measured than evaporation, estimates of  $P - Q$  based  
20 on ground measurements of these two fluxes provide a convenient means to evaluate evaporation over large domains and long periods (Liu et al., 2014; Miralles et al., 2011a; Vinukollu et al., 2011b; Sahoo et al., 2011). Here, we use globally-distributed multi-annual river discharge data for basins larger than  $2500 \text{ km}^2$ . Discharge data and watershed boundaries are obtained from the Global Runoff Data Centre (GRDC, 2013).  
25 Runoff data have been converted from cumecs into  $\text{mm yr}^{-1}$  using the area of each

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



catchment as reported by the GRDC; basins where the absolute difference between the GRDC reported area and the area calculated from basin boundaries exceeded 25 % have been excluded from the analyses.

Precipitation for the target period 2005–2007 is taken from GPCP (Huffman et al., 2001) and the Global Precipitation Climatology Centre (GPCC) v6 (Schneider et al., 2013). Two versions of GPCC v6 are processed by applying relative gauge correction factors according to Fuchs et al. (2001) and Legates and Willmott (1990) to the native GPCC products as recommended by the producers. We further discard basins with (a priori) low-quality precipitation due to the low density of rain gauges ( $< 0.1$  per  $0.5^\circ$  latitude–longitude), frequent snowfall ( $> 25$  days per year based on CloudSat), or where cumulative values of discharge exceed those of precipitation over the three-year period. Finally, net radiation data from the NASA Clouds and Earth’s Radiant Energy System (CERES) SYN1deg product (Wielicki et al., 2000) are used to exclude basins where  $P - Q$  exceeds net radiation on average.

This results in a record of 837 basins from which  $P - Q$  values are calculated. Figure 1 illustrates the location of the centroids of these catchments. Basins are then clustered in 30 classes based on log-transformed precipitation, net radiation, and evaporative fraction (i.e. evaporation over net radiation). This is done in order to reduce noise and retain clear patterns for evaluation. The clustering algorithm used is a  $k$  means with cityblock distance, with variables transformed to zero mean and unit variance. For clarity, each of the 30 classes is assigned to one of four groups based on thresholds of net radiation ( $80 \text{ W m}^{-2}$ ) and evaporative fraction (0.5) as shown in Fig. 1. The results of comparing the evaporation products, integrated over the corresponding basins, to the  $P - Q$  estimates are presented in Sect. 3.3.

## HESSD

12, 10651–10700, 2015

### The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



## 3 Results and discussion

### 3.1 Global magnitude of terrestrial evaporation

The global mean annual volume of evaporation has been intensively debated in recent years (see e.g. Wang and Dickinson, 2012), with the range of reported global-averages in current CMIP5 models being large (Wild et al., 2014) and observational benchmark data sets also differing significantly (Mueller et al., 2013). In this section, we aim to give some context to the global magnitude of evaporation that results from the WACMOS-ET analyses by contrasting the results against alternative evaporation data sets and existing literature. Unless otherwise noted, results come from aggregating the outputs from the 3 hourly global runs based on the 25 km spatial resolution of the reference input data set for the period 2005–2007.

Overall, the total annual magnitude of evaporation estimated by the WACMOS-ET models amounts to  $54.9 \times 10^3 \text{ km}^3$  for PM-MOD,  $72.9 \times 10^3 \text{ km}^3$  for GLEAM and  $72.5 \times 10^3 \text{ km}^3$  for PT-JPL. We further calculated  $84.4 \times 10^3 \text{ km}^3$  for ERA-Interim and  $68.3 \times 10^3 \text{ km}^3$  for MTE based on the same 2005–2007 period. For comparison, values typically found in literature based on a broad variety of methodologies and forcings are:  $65.0 \times 10^3 \text{ km}^3$  (Jung et al., 2010),  $65.5 \times 10^3 \text{ km}^3$  (Oki and Kanae, 2006),  $65.8 \times 10^3 \text{ km}^3$  (Schlosser and Gao, 2010),  $67.9 \times 10^3 \text{ km}^3$  (Miralles et al., 2011a),  $71 \times 10^3 \text{ km}^3$  (Baumgartner and Reichel, 1975), and  $73.9 \times 10^3 \text{ km}^3$  (Wang-Erlandsson et al., 2014). We note that some of these studies considered the poles and desert regions, while others did not; however, the contribution from these areas to the global means is rather marginal (< 5% of the total based on our analyses). Further, the study period considered in WACMOS-ET is 2005–2007, while previously reported annual averages may be based on different periods.

In Fig. 2 the multiannual (2005–2007) mean evaporation is displayed for the different products, including also MTE and ERA-Interim for comparison. All five data sets capture well the expected climatic transitions, although disagreements at the regional scale are still considerable (see below). The latitudinal averages are illustrated in the

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

⏴

⏵

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**The WACMOS-ET project – Part 2**

D. G. Miralles et al.

right panel of Fig. 2. Model estimates are normally contained between the low values from PM-MOD and the high values from ERA-Interim; as an exception, PM-MOD can be comparatively high in Northern Hemisphere high latitudes (see Sect. 3.2). In Fig. 2, the latitudinal profiles from the original/official products from PM-MOD (i.e. MOD16), GLEAM (i.e. GLEAM v1) and PT-JPL (i.e. PT-Fisher) are also displayed for comparison. Note that the main differences between these official products and those developed in WACMOS-ET relate to the choice of forcing – see Mu et al. (2013), Miralles et al. (2011a) and Fisher et al. (2008) for the particular forcing data used to generate the official data sets. In addition, these models have been run here at sub-daily scale (three hourly) as opposed to their original daily (PM-MOD, GLEAM) or monthly (PT-JPL) temporal resolutions. While for PM-MOD and PT-JPL the choice of temporal resolution and forcing in WACMOS-ET leads to overall lower values (see PM-MOD in tropics), for GLEAM, values are slightly higher than in the original version (v1).

Inter-product differences in mean evaporation become more evident in Fig. 3, which presents the anomalies for each product calculated by subtracting the average of the five-product ensemble. PM-MOD displays lower averages than the multi-product ensemble mean over the entire continental domain, with the exception of high-latitude regions, as discussed above. GLEAM shows higher than average values in Europe or Amazonia, and lower in North America. This pattern is somewhat shared by PT-JPL, although the two models disagree substantially in water-limited regions of Africa and Australia, even if absolute mean values are low in those areas (see Fig. 2). This relates to the different model representation of evaporative stress, with GLEAM being based on observations of rainfall, surface soil moisture and vegetation optical depth, while PT-JPL is based on air humidity, maximum air temperature and NDVI. As mentioned in Sect. 2.2, it is important to note that even if we aimed to maximise consistency in forcing data for PM-MOD, GLEAM and PT-JPL, their disagreement still reflects a combination of algorithm structural errors and input uncertainties, given the use of a distinct range of inputs for each model (Table 1) and the different model sensitivities to each particular driver.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

ERA-Interim values are often at the high end of predictions, consistent with the results by Mueller et al. (2013), more than doubling the evaporation estimated by PM-MOD on some occasions (Fig. 2). MTE values, on the other hand, are lower than the inter-product average in the Himalayas and in tropical forests – which may potentially relate to the lack of a separate computation of interception loss and the long-lasting question of whether interception can be measured with eddy-covariance instruments – but they agree well with the mean of the multi-product ensemble in other regions (Fig. 3). A quick overview on the range of uncertainty that can be expected may be obtained from the right panel of Fig. 3, where the latitudinal profiles of anomalies are illustrated. Data sets appear again to be confined between the low values of PM-MOD and the high values of ERA-Interim. If that multi-model range is interpreted as an indication of the uncertainty, it is worth noting that it may amount to 60–80 % of the mean evaporation, particularly in the subtropics. In the tropics, while the relative uncertainty is lower, the inter-product range still reaches  $\sim 500 \text{ mm yr}^{-1}$  according to the latitudinal profiles in Fig. 3. To put that volume into context, the mean annual evaporation is below  $500 \text{ mm yr}^{-1}$  for more than 50 % of continental surfaces, according to the inter-product ensemble mean.

The spatial agreement among models is further explored in Fig. 4, which presents the spatial correlation for each pair of models based on their long-term global means (i.e. the maps in Fig. 2). Each land pixel is an independent point in the scatter. The lowest spatial correlation occurs between PM-MOD and GLEAM ( $R = 0.89$ ), and the highest between GLEAM and PT-JPL ( $R = 0.94$ ). Although this may reflect the common choice of a Priestley and Taylor approach to calculate potential evaporation in GLEAM and PT-JPL, it occurs despite their large differences in input requirements (Table 1) and in the approach to derive evaporative stress and interception loss (Sect. 2.1). Yet, the agreement in the mean spatial patterns between PM-MOD and PT-JPL is also high in terms of correlation coefficient ( $R = 0.93$ ), as expected from their shared set of input variables (see Table 1).



## 3.2 Temporal variability of terrestrial evaporation

In addition to long-term mean differences in evaporation, inter-product discrepancies in temporal dynamics are certainly expected. Temporal correlations based on the (2005–2007) daily time series for each pair of models are illustrated in Fig. 5a. The overall agreement in temporal dynamics is larger in high latitudes and in the tropics, especially between GLEAM and PT-JPL. In semiarid regions, product-to-product correlations are often below 0.5 and may drop below 0.2 (see e.g. low correlation between PM-MOD and PT-JPL in Australia), even if the large amplitude of the seasonal cycle in these transitional regimes could potentially lead to high temporal correlations. Overall, Fig. 5a corroborates that, although the agreement between GLEAM and PT-JPL is large, their different approach to estimating water-availability constraints on evaporation and rainfall interception loss leads to significant differences for semiarid regions and tropical forests.

Based on the monthly climatology of each model (calculated by averaging the estimates for the same month of the year considering the multi-year 2005–2007 period), Fig. 5b illustrates the month in which the differences between a given pair of models are largest. In the Northern Hemisphere, the product-to-product differences are at their maximum during summertime, when the flux of evaporation is larger. This is particularly the case in comparisons to PM-MOD, given that the seasonal evaporation peak of PM-MOD is often less pronounced than for the other models (see also Figs. 6 and 7). In the tropics and the Southern Hemisphere, maximum differences between models occur at different times of the year, but often coincide with months of higher evaporative demand for water; this is the case for southern Africa, the Pampas region or Australia during the Austral summer.

Figure 6 shows the average evaporation for boreal summer (JJA) and winter (DJF) for each model based on the three-year period of study. MTE and ERA-Interim are again presented for comparison. As expected, the seasonal variability of evaporation follows the annual cycle of radiation, except for arid and semi-arid regions that are controlled

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[|◀](#)[▶|](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

by the availability of water. The lower values of PM-MOD are again highlighted. The underestimation of PM-MOD, with respect to the other two models, mostly occurs in times and locations for which both evaporative demand and water availability are high, thus evaporation is expected to be high as well (e.g. mid-latitude summer, tropics).

5 However, PM-MOD is often higher than the other two models in periods and regions where radiation is severely limited, potentially due to the underestimation of Priestley–Taylor type models (i.e. GLEAM and PT-JPL) when radiation is not the main supply of energy for evaporation (see e.g. Parlange and Katul, 1992), while the Penman–Monteith equation still considers adiabatic sources of energy to drive evaporation. Once  
10 more, differences in seasonal averages between GLEAM and PT-JPL may also exist at the regional scale, especially in water-limited regimes, with Australia being a clear example (see also Fig. 8).

Nonetheless, Fig. 6 still shows a general agreement amongst the five models in their representation of seasonal dynamics. This agreement becomes also apparent in Fig. 7,  
15 which presents the seasonal monthly climatology of evaporation over different biome types. Except for densely vegetated regions (see e.g. Southern Hemisphere tropical forests), arctic regions or arid regimes (see e.g. Northern Hemisphere deserts), all models capture similar monthly dynamics. This occurs despite the systematic differences in the absolute magnitudes of evaporation, which become again apparent – especially  
20 between PM-MOD and ERA-Interim – and may indicate limitations in the way that the processes governing land evaporation are represented in our models. This highlights the importance of validation activities to improve and select algorithms.

Since the seasonal dynamics in evaporation are mostly dominated by the annual cycle of irradiance in nature (especially in energy-limited regions), the skill of these models in correctly capturing these seasonal dynamics relies mostly on adequately representing the sensitivity of evaporation to the (common) net radiation forcing. However, if  
25 estimating average seasonal dynamics in evaporation may not appear overly challenging from the modelling perspective, accurately simulating anomalies (i.e. departures) relative to a seasonal expectation is far more problematic. With hydro-meteorological

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)

[Abstract](#)

[Introduction](#)

[Conclusions](#)

[References](#)

[Tables](#)

[Figures](#)

[⏪](#)

[⏩](#)

[⏴](#)

[⏵](#)

[Back](#)

[Close](#)

[Full Screen / Esc](#)

[Printer-friendly Version](#)

[Interactive Discussion](#)



extremes – and particularly droughts – being a target application of these models, correctly reproducing the effect of surface water deficits on evaporation (and vice versa) appears crucial. One of the most remarkable hydro-meteorological extremes that coincide with the WACMOS-ET period is the Australian Millennium Drought, which affected (especially) southeastern Australia, and had in 2006 one of its most severe years of rainfall deficits (see van Dijk et al., 2013; Leblanc et al., 2012). Figure 8a shows the daily time series of evaporation for the Darling basin (area contoured in Fig. 1) from the three WACMOS-ET models during 2005–2007; ERA-Interim evaporation is also included for comparison. Figure 8b presents the monthly aggregates instead, and incorporates the estimates of evaporation from MTE, precipitation from GPCC v6 (with gauge correction factors from Fuchs et al., 2001) and river discharge data from GRDC.

Given the arid conditions – especially pronounced during 2006 and 2007 – the mean annual runoff is very low, and the river in fact dries out completely for prolonged periods (note also the more than two orders of magnitude difference between the right and left vertical axes in Fig. 8b). This indicates that almost the entire volume of incoming rainfall is evaporated, thus cumulative evaporation should approximate cumulative precipitation over the multi-year period. We find, however, that in the case of all models except for PM-MOD, evaporation is larger than the total rainfall for the three years: only 1 % higher for GLEAM, 10 % higher for PT-JPL, 16 % higher for MTE and 36 % higher for ERA-Interim. To some extent, this could reflect the progressive soil dry out as the drought event evolves (i.e. the negative change in soil storage in time), or the accessibility of groundwater for root uptake (see e.g. Chen and Hu, 2004; Orellana et al., 2012), but in fact, there is a general tendency from all models to overestimate evaporation in drier catchments, as discussed in the following Sect. 3.3. Once more, Fig. 8 points that the estimates from the different products typically range between the low values of PM-MOD and high values of ERA-Interim, and that there is a general agreement on the temporal dynamics between GLEAM, PT-JPL and MTE. Yet, there are clear differences in the timing of water stress and the rates of evaporation decline

(see e.g. summer 2006), and the inter-product disagreement at short temporal scales (Fig. 8a) is considerably larger than the disagreement in mean seasonal cycles (Fig. 7).

### 3.3 Evaluation of evaporation based on the water balance closure

The skill of the different models to close the water budgets over 837 basins is investigated here. As explained in Sect. 2.3.2, these analyses consist of a comparison of modelled evaporation estimates from PM-MOD, GLEAM and PT-JPL (forced by the reference input data set over 2005–2007) against estimates of  $P - Q$ . Such a comparison implies the validity of a series of assumptions (see discussion below), but overall,  $P - Q$  estimates remain a valid, recursive means to evaluate long-term evaporation patterns (Liu et al., 2014; Miralles et al., 2011a; Vinukollu et al., 2011b; Sahoo et al., 2011). Here, different criteria have been applied to ensure the quality of the  $P - Q$  estimates, and the remaining catchments (Fig. 1) have been clustered into 30 different classes based on average precipitation and evaporative fraction (see Sect. 2.3.2).

The skill of the three WACMOS-ET models to reproduce the general climatic patterns of evaporation becomes apparent from the scatterplots in Fig. 9. All three WACMOS-ET products correlate well with the observations, which implies that their long-term spatial distribution of evaporation (Fig. 2) is overall realistic. The general negative bias of PM-MOD becomes again discernible when compared to the  $P - Q$  data, which is in agreement with the results by Mu et al. (2013). In addition, there is a tendency from all models to underestimate evaporation in wet regions and overestimate in dry regions – the latter was already suggested in Fig. 8. While, this pattern could potentially be explained by systematic errors in  $P - Q$  (see discussion below on the possible sources of errors when considering  $P - Q$  as a proxy for evaporation), the same tendency has been found in Part 1 in comparisons against independent eddy-covariance towers. Once more, it is interesting to see how the independent evaporation data sets, i.e. ERA-Interim and MTE, perform in this comparison; both products correlate well with the  $P - Q$  estimates, although the overall higher values of ERA-Interim (and lower of

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



MTE) are again highlighted, together with the tendency to overestimate evaporation in dry catchments and underestimate in wet ones, which shared by all five data sets.

As mentioned above, the use of  $P - Q$  as a benchmark for evaporation depends on the validity of several assumptions. First, the catchment needs to be watertight (no sub-surface leakage to other catchments) and its geographical boundaries must be well defined. Second, the entire volume of river water that is extracted for direct human use must return to the river, and it shall do so upstream of the staff gauge location. Third, the lag-time between rainfall events and the discharge measured at the station can be neglected when compared to the total period of study. Finally, the changes in soil water storage within the catchment should be insignificant compared to the cumulative volume of the three main hydrological fluxes. Here, by considering long-term averages of  $P - Q$ , these assumptions appear to be reasonable for most continental regions. However, for industrialised areas with dense population, the consumption and export of water and the human regulation of the reservoir storages may compromise these assumptions. Nonetheless, the largest sources of uncertainty regarding the use of  $P - Q$  as estimate of catchment evaporation likely come from (a) the definition of the runoff-contributing area, and (b) errors in precipitation and discharge observations. In fact, Fig. 9 shows that the choice of precipitation product can have a significant influence in the results, even despite the existing inter-dependencies between the gauge-based precipitation data sets tested here (Sect. 2.3.2). On the other hand, uncertainties in observations of river runoff can also be significant, and come from errors in the measurements of river height, the discharge data used to calibrate the rating curves, or the interpolation and extrapolation due to changes in riverbed roughness, hysteresis effects, etc. (see e.g. Di Baldassarre and Montanari, 2009). Finally, it is important to note that model estimates correspond to the period 2005–2007, while  $P - Q$  estimates do not necessarily span the same period due to the limited availability of discharge data. This implicitly assumes that the multi-annual variability in evaporation is significantly lower than its spatial climatological variability across the globe.

The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures



Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

Additionally, the fit of the models to a Budyko curve (Budyko, 1974) is explored in Fig. 10 as a general diagnostic for the robustness of mean evaporation estimates and their consistency with the input of water and energy. Potential evaporation estimates are taken from the corresponding models and precipitation from the GPCP v6 product with gauge correction factors from Fuchs et al. (2001), to be consistent with Figs. 8 and 9. Overall, results are in agreement with the water balance scatterplots (Fig. 9). The fraction of precipitation that is evaporated ( $E/P$ ) is usually lower for PM-MOD; however, this does not happen due to an underestimation of the atmospheric demand for water, as the values of the ratio of potential evaporation over precipitation ( $E_p/P$ ) are overall comparable to those from GLEAM and PT-JPL. The PM-MOD product has therefore a general tendency to overestimate the surface evaporative stress (i.e. underestimate the ratio  $E/E_p$ ), which may explain the overall lower estimates of evaporation found across our analyses. GLEAM and PT-JPL show a better fit to the Budyko diagram, and a transition from arid to wet climates that is consistent with the average fluxes of precipitation and net radiation. Nevertheless, it is worth noting that all three models estimate average values of evaporation that overcome average precipitation in numerous locations.

### 3.4 Partitioning of evaporation into separate components

The flux of land evaporation results from the summation of three main components or sources: (a) transpiration (the process that describes the movement of water from the soil, through the plant xylem, to the leaf and finally to the atmosphere), (b) interception loss (the vaporization of the volume of water that is held by the surface of vegetation during rainfall), and (c) soil evaporation (the direct vaporization of water from the topsoil). These processes require separate consideration in our models due to their differences in bio-physical drivers and rates (Savenije, 2004; Dolman et al., 2014). In addition, two other contributors to evaporation are often considered separately: the direct evaporation (sublimation) from snow- and ice-covered surfaces and the vaporization from continental water bodies (or open-water evaporation).

**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

Transpiration is the component that has received the most attention by the scientific community in recent years, due to its connection to different biogeochemical cycles. The global contribution of transpiration to total average evaporation has been extensively debated recently (Schlesinger and Jasechko, 2014; Wang et al., 2014). Studies have reported values ranging between 35–90 %, based on isotopes (Jasechko et al., 2013; Coenders-Gerrits et al., 2015), sap-flow measurements (Moran et al., 2009), satellite data (Miralles et al., 2011a; Mu et al., 2011) or modelling (Wang-Erlandsson et al., 2014). Consequently, this large range of uncertainty is also expected in the relative contribution from other evaporation sources. Moreover, reducing this uncertainty appears particularly challenging due to the limited amount of ground data that can be used for validation and the nature of the techniques used to measure latent heat flux: most measuring techniques (e.g. lysimeters, eddy-covariance instruments, scintillometers) cannot distinguish amongst the different sources of evaporation.

All three WACMOS-ET models estimate the components of evaporation separately. In the case of PT-JPL and PM-MOD, the available energy is partitioned into the different land covers to estimate the contribution from each of them. The approach in GLEAM is somewhat different, as the flux of interception loss is calculated using a different algorithm than the one used for transpiration and soil evaporation. Figure 11 illustrates the average contribution of each evaporation component to the total flux as estimated by the WACMOS-ET models. In the case of GLEAM (which calculates sublimation separately), the flux from snow and ice has been added to the bare soil evaporation in this figure to allow comparison to the other two products.

The discrepancy amongst modelled evaporation components shown in Fig. 11 is large, and calls for a thorough validation of the way the contribution from different sources is estimated, and even a revision to ensure that the conceptual definition of these components is consistent from model to model. Regionally, disagreements are particularly large in transitional regimes; for instance, in the climatic gradient from the Congo rainforest to the savanna, the virtual totality of the flux comes from transpiration in the case of GLEAM, while for PM-MOD direct soil evaporation is the dominant com-

**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

ponent. In tropical forests, the direct soil evaporation can also exceed transpiration in the case of PM-MOD, while for GLEAM and PT-JPL bare-soil evaporation is almost inexistent. The mean inter-model disagreement is manifest in the pie diagrams in Fig. 11, with GLEAM estimating a large contribution from transpiration (76 %) and low from soil evaporation (14 %), PM-MOD estimating little transpiration (24 %) and a large contribution from soil evaporation (52 %), and both PM-MOD and PT-JPL yielding a much larger flux of interception loss than GLEAM. Nevertheless, and as discussed above, recent reviews have revealed comparable levels of uncertainty based on a wide range of independent methods (Schlesinger and Jasechko, 2014; Wang et al., 2014).

While the global contribution of transpiration has received much attention in literature (Jasechko et al., 2013; Coenders-Gerrits et al., 2015), the flux of interception loss has seldom been explored globally (Miralles et al., 2010; Vinukollu et al., 2011b; Wang-Erlandsson et al., 2014). The physical process of interception loss differs from that of transpiration on its sensitivity to environmental and climatic variables: the rates and magnitude of interception are dictated by the aerodynamic properties of the vegetation stand, and the occurrence and characteristics of rainfall (Horton, 1919). In fact, while solar radiation is normally the main supply of energy for transpiration and soil evaporation (Wild and Liepert, 2010), the source of energy powering interception loss is still debated (Holwerda et al., 2011). The limited process understanding, together with the scarcity of ground measurements for validation, makes interception loss particularly challenging to model. Nonetheless, interception has often been reported in units of percentage of incoming rainfall during the restricted number of past in situ campaigns (see e.g. Miralles et al. (2010) for a non-exhaustive list of these campaigns). This makes interception measurements easy to extrapolate in time and space, and it allows for a relatively straightforward validation of the estimates from our three models. Therefore, Fig. 12 presents the daily time series of interception loss from PM-MOD, GLEAM and PT-JPL for the average of the Amazon basin (blue contour in Fig. 1), and indicates the values reported by past field campaigns in Amazonia. According to these in situ campaigns, all models overestimate interception loss; remarkably, in the case of



**The WACMOS-ET project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[⏴](#)[⏵](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

PM-MOD and PT-JPL there is over a two-fold overestimation of the mean flux. Temporal dynamics of interception loss from the three products do not correlate well either, as GLEAM tends to follow the occurrence of rainfall, while PM-MOD and PT-JPL are more affected by net radiation variability, as expected from the algorithms (i.e. Gash's model for GLEAM, Penman–Monteith for PM-MOD and Priestley and Taylor for PT-JPL).

Further analyses are needed to explore the skill of these (and other) models to separately derive the different evaporation components or sources. Nevertheless, these preliminary analyses point at the need for caution when using global estimates of transpiration, soil evaporation or interception loss from a single model in isolation, as the disagreements can be much larger than for total land evaporation. Up to date, the lack of in situ networks that measure the components of evaporation independently remains an inexorable bottleneck for the improvement of model estimates.

## 4 Conclusions

The ESA WACMOS-ET project started in 2012 with the goal of performing a cross-comparison and validation exercise of a group of selected global observational evaporation algorithms driven by a consistent set of forcing data. With the project coming to an end, this article has focussed on the global and regional evaluation of the resulting evaporation products.

The three main products scrutinised here were the Penman–Monteith approach from the official MODIS evaporation product (Mu et al., 2007, 2011, 2013), GLEAM (Miralles et al., 2011a, b; Martens et al., 2015) and the Priestley–Taylor JPL model (Fisher et al., 2008); the SEBS model (Su, 2001), which was analysed at the local scale in Part 1 (revealing good performance in terms of correlations but a systematic overestimation of evaporation), was not evaluated in this contribution. The spatiotemporal magnitude and variability of the three global evaporation products were compared to analogous estimates from reanalysis (ERA-Interim) and eddy-covariance-based global data (MTE). The representation of evaporation dynamics during droughts, the model skill to close

the water balance over 837 river basins worldwide, and the model partitioning of evaporation into different components have also been explored.

Despite our efforts to create a homogeneous forcing data set to run the evaporation models, the input requirements of each model are different, which implies that the resulting inter-product disagreements are the result of both internal differences in the models, and uncertainties in forcing and ancillary data. This prevents us from making strong claims about the quality of the models. However, there is also a list of take-home messages to learn from these analyses:

- In agreement with the local-scale validation in Part 1, the PM-MOD product tends to underestimate evaporation (see e.g. Figs. 3 and 9). This underestimation is systematic, being larger in absolute terms in the tropics (where evaporation is larger), and larger in relative terms in drier subtropical regions (Fig. 3). As an exception, in high latitudes PM-MOD estimates are greater than those from GLEAM and PT-JPL; this may reflect known deficiencies in Priestley–Taylor-based approaches over conditions of low available energy (see e.g. Parlange and Katul, 1992).
- The global average magnitude of evaporation from GLEAM and PT-JPL agree well with each other and with the envelope of literature values (see Figs. 2 and 4). This agreement extends to the average latitudinal patterns, which lay between those of PM-MOD and ERA-Interim (Figs. 2 and 3). In terms of temporal dynamics, there are differences between GLEAM and PT-JPL in dry conditions, as expected from their distinctive approach at representing evaporative stress (see Sect. 2.1). These differences are pronounced in the Southern Hemisphere subtropics (Fig. 5a), reflect more clearly in daily anomalies than in seasonal cycles (Fig. 7), and may exacerbate during specific drought events (Fig. 8).
- The partitioning of evaporation into different components is a facet of these models that has not received enough attention in previous applications. Each model has a distinct way to estimate these components, and even in cases in which inter-product average evaporation agrees, the separate contribution from these compo-

# HESSD

12, 10651–10700, 2015

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

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



## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)

[Abstract](#)

[Introduction](#)

[Conclusions](#)

[References](#)

[Tables](#)

[Figures](#)

[I◀](#)

[▶I](#)

[◀](#)

[▶](#)

[Back](#)

[Close](#)

[Full Screen / Esc](#)

[Printer-friendly Version](#)

[Interactive Discussion](#)



nents may fluctuate substantially (Fig. 11). As an example, differences in interception loss amongst models (Fig. 12) may explain a large part of the disagreements in the seasonality of evaporation over tropical forests (Fig. 7). Further exploring the skill of the models at partitioning evaporation into its different sources remains a critical task for the future. This is outside the scope of WACMOS-ET and it would require innovative means of validation beyond traditional comparisons to eddy-covariance and lysimeter data.

- On a more positive note, the analysis of the skill of different models to close the water balance over particular catchments reveals that the general climatic patterns of evaporation are well captured by all models (Fig. 9). While this comparison has also unveiled the general underestimation by PM-MOD (and overestimation by ERA-Interim), all products correlate well with the cumulative values of  $P - Q$ . We stress however that this agreement does not indicate whether the multi-scale temporal dynamics of evaporation are well captured. For a thorough validation of evaporation temporal variability, we direct the readers to Part 1.

In summary, the activities in WACMOS-ET have demonstrated that some of the existing evaporation models and products require an in-depth scrutiny to correct for systematic errors in their estimates. This is especially the case over semi-arid regions and tropical forests. In addition, even models that have demonstrated a more robust performance, like GLEAM and PT-JPL, may differ substantially from one another under certain biomes and climates. Overall, our results imply the need for caution in using a single model for any large-scale application in isolation, especially in studies in which transpiration, soil evaporation or interception loss are investigated separately.

As remote sensing science continues advancing, new long-term records of physical variables to constrain these models are becoming available (e.g. chlorophyll fluorescence, surface soil water content). While new tools to improve evaporation models become accessible, the possibility for considering biome- or climate-specific composites of flux algorithms is currently being explored, given the general finding that different

models may perform better under certain conditions (Ershadi et al., 2014; McCabe et al., 2015). For an inter-product merger to add new skill, the sensitivity of each model to its forcing should be further explored, and a robust propagation of uncertainties appears essential to merge these products efficiently.

5 The reader is directed to additional supporting documents available from the project website at <http://WACMOS-ET.estellus.eu>.

*Author contributions.* D. G. Miralles, C. Jiménez, M. Jung, D. Michel, A. Ershadi, M. F. McCabe, M. Hirschi and D. Fernández-Prieto designed the content of the manuscript. D. G. Miralles, C. Jiménez and M. Jung did the analyses. D. G. Miralles wrote the paper. J. B. Fisher and Q. Mu provided the computer codes of the PT-JPL and PM-MOD models, respectively. All 10 authors contributed to the accomplishment of the project, and the discussion and interpretation of results.

*Acknowledgements.* This work was undertaken as part of the European Space Agency (ESA) project WACMOS-ET (Contract No. 4000106711/12/I-NB). Discharge data were provided by the Global Runoff Data Centre, 56068 Koblenz, Germany. We thank Ulrich Weber and Eric Thomas for processing the catchment data. D. G. Miralles acknowledges the financial support from the Netherlands Organization for Scientific Research through grant 863.14.004, and the Belgian Science Policy Office (BELSPO) in the frame of the STEREO III programme, project SAT-EX (SR/00/306). A. Ershadi and M. F. McCabe acknowledge funding from the King Abdul- 15 lah University of Science and Technology. J. B. Fisher acknowledges funding under the NASA Terrestrial Hydrology Program. 20

# HESSD

12, 10651–10700, 2015

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)

[Abstract](#)

[Introduction](#)

[Conclusions](#)

[References](#)

[Tables](#)

[Figures](#)

[I◀](#)

[▶I](#)

[◀](#)

[▶](#)

[Back](#)

[Close](#)

[Full Screen / Esc](#)

[Printer-friendly Version](#)

[Interactive Discussion](#)



## References

- Baldocchi, D., Falge, E., Gu, L., Olson, R., Hollinger, D., Running, S., Anthoni, P., Bernhofer, C., Davis, K., Evans, R., Fuentes, J., Goldstein, A., Katul, G., Law, B., Lee, X., Malhi, Y., Meyers, T., Munger, W., Oechel, W., Paw, K. T., Pilegaard, K., Schmid, H. P., Valentini, R., Verma, S., Vesala, T., Wilson, K., and Wofsy, S.: FLUXNET: a new tool to study the temporal and spatial variability of ecosystem-scale carbon dioxide, water vapor, and energy flux densities, *B. Am. Meteorol. Soc.*, 82, 2415–2434, 2001.
- Baumgartner, A. and Reichel, E.: *The World Water Balance: Mean Annual Global Continental and Maritime Precipitation, Evaporation and Runoff*, Elsevier Scientific Publishing Company, Amsterdam, the Netherlands; Oxford, UK, New York, USA, 1975.
- Budyko, M. I.: *Climate and Life*, International Geophysics Series, Academic Press, New York, 1974.
- Chen, M., Shi, W., Xie, P., Silva, V. B. S., Kousky, V. E., Wayne Higgins, R., and Janowiak, J. E.: Assessing objective techniques for gauge-based analyses of global daily precipitation, *J. Geophys. Res.*, 113, D04110, doi:10.1029/2007JD009132, 2008.
- Chen, X. and Hu, Q.: Groundwater influences on soil moisture and surface evaporation, *J. Hydrol.*, 297, 285–300, doi:10.1016/j.jhydrol.2004.04.019, 2004.
- Chen, Y., Xia, J., Liang, S., Feng, J., Fisher, J. B., Li, X., Li, X., Liu, S., Ma, Z., Miyata, A., Mu, Q., Sun, L., Tang, J., Wang, K., Wen, J., Xue, Y., Yu, G., Zha, T., Zhang, L., Zhang, Q., Zhao, T., Zhao, L., Zhou, G., and Yuan, W.: Comparison of satellite-based evapotranspiration models over terrestrial ecosystems in China, *Remote Sens. Environ.*, 140, 279–293, 2015.
- Cleugh, H. A., Leuning, R., Mu, Q., and Running, S. W.: Regional evaporation estimates from flux tower and MODIS satellite data, *Remote Sens. Environ.*, 106, 285–304, doi:10.1016/j.rse.2006.07.007, 2007.
- Coccia, G. and Wood., E. F.: CFSR-Land: a new high temporal resolution global land data assimilation product, *J. Geophys. Res.*, in preparation, 2015.
- Coenders-Gerrits, A. M. J., van der Ent, R. J., Bogaard, T. A., Wang-Erlandsson, L., Hrachowitz, M., and Savenije, H. H. G.: Uncertainties in transpiration estimates, *Nature*, 506, E1–E2, doi:10.1038/nature12925, 2015.
- Cuartas, L., Tomasella, J., Nobre, A., Hodnett, M., Waterloo, M., and Múnera, J.: Interception water-partitioning dynamics for a pristine rainforest in Central Amazonia: marked differences between normal and dry years, *Agr. Forest Meteorol.*, 145, 69–83, 2007.

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

- Czikowsky, M. and Fitzjarrald, D.: Detecting rainfall interception in an Amazonian rain forest with eddy flux measurements, *J. Hydrol.*, 377, 92–105, 2009.
- Dalton, J.: On evaporation. Essay III, in: *Experimental essays on the 121 constitution of mixed gases; on the force of steam or vapour from water or other liquids in different temperatures; both in a Torrecellian vacuum and in air; on evaporation; and on the expansion of gases by heat*, *Mem. Proc. Lit. Phil. Soc. Manchester*, 5, 574–594, 1802.
- Dee, D. P., Uppala, S. M., Simmons, A. J., Berrisford, P., Poli, P., Kobayashi, S., Andrae, U., Balmaseda, M. A., Balsamo, G., Bauer, P., Bechtold, P., Beljaars, A. C. M., van de Berg, L., Bidlot, J., Bormann, N., Delsol, C., Dragani, R., Fuentes, M., Geer, A. J., Haimberger, L., Healy, S. B., Hersbach, H., Hólm, E. V., Isaksen, I., Kållberg, P., Köhler, M., Matricardi, M., McNally, A. P., Monge-Sanz, B. M., Morcrette, J. J., Park, B. K., Peubey, C., De Rosnay, P., Tavolato, C., Thépaut, J. N., and Vitart, F.: The ERA-Interim reanalysis: configuration and performance of the data assimilation system, *Q. J. Roy. Meteorol. Soc.*, 137, 553–597, 2011.
- Di Baldassarre, G. and Montanari, A.: Uncertainty in river discharge observations: a quantitative analysis, *Hydrol. Earth Syst. Sci.*, 13, 913–921, doi:10.5194/hess-13-913-2009, 2009.
- Dolman, A. J., Miralles, D. G., and De Jeu, R. A. M.: Fifty years since Monteith's 1965 seminal paper: the emergence of global ecohydrology, *Ecohydrology*, 7, 897–902, doi:10.1002/eco.1505, 2014.
- Douville, H., Ribes, A., Decharme, B., Alkama, R., and Sheffield, J.: Anthropogenic influence on multidecadal changes in reconstructed global evapotranspiration, *Nat. Clim. Change*, 2, 1–4, 2012.
- Ershadi, A., McCabe, M. F., Evans, J. P., Chaney, N. W., and Wood, E. F.: Multi-site evaluation of terrestrial evaporation models using FLUXNET data, *Agr. Forest Meteorol.*, 187, 46–61, doi:10.1016/j.agrformet.2013.11.008, 2014.
- Fisher, J. B., Tu, K. P., and Baldocchi, D. D.: Global estimates of the land–atmosphere water flux based on monthly AVHRR and ISLSCP-II data, validated at 16 FLUXNET sites, *Remote Sens. Environ.*, 112, 901–919, 2008.
- Fuchs, T., Rapp, J., Rubel, F., and Rudolf, B.: Correction of synoptic precipitation observations due to systematic measuring errors with special regard to precipitation phases, *Phys. Chem. Earth*, 26, 689–693, 2001.
- Gash, J. H.: An analytical model of rainfall interception by forests, *Q. J. Roy. Meteorol. Soc.*, 105, 43–45, 1979.

The WACMOS-ET  
project – Part 2

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

- Guilod, B. P., Orlowsky, B., Miralles, D. G., Teuling, A. J., and Seneviratne, S. I.: Reconciling spatial and temporal soil moisture effects on afternoon rainfall, *Nat. Commun.*, 6, 1–6, doi:10.1038/ncomms7443, 2015.
- Hagemann, S., Chen, C., Clark, D. B., Folwell, S., Gosling, S. N., Haddeland, I., Hanasaki, N., Heinke, J., Ludwig, F., Voss, F., and Wiltshire, A. J.: Climate change impact on available water resources obtained using multiple global climate and hydrology models, *Earth Syst. Dynam.*, 4, 129–144, doi:10.5194/esd-4-129-2013, 2013.
- Holwerda, F., Bruijnzeel, L. A., Scatena, F. N., Vugts, H. F., and Meesters, A. G. C. A.: Wet canopy evaporation from a Puerto Rican lower montane rain forest: the importance of realistically estimated aerodynamic conductance, *J. Hydrol.*, 414–415, 1–15, doi:10.1016/j.jhydrol.2011.07.033, 2011.
- Horton, R. E.: Rainfall interception, *Mon. Weather Rev.*, 47, 603–625, 1919.
- Huffman, G. J., Adler, R. F., Morrissey, M., Bolvin, D. T., Curtis, S., Joyce, R., McGavock, B., and Susskind, J.: Global precipitation at one-degree daily resolution from multi-satellite observations, *J. Hydrometeorol.*, 2, 36–50, 2001.
- Jarvis, P. G.: The interpretation of the variations in leaf water potential and stomatal conductance found in canopies in the field, *Philos. T. Roy. Soc. Lond.*, 273, 593–610, 1976.
- Jasechko, S., Sharp, Z. D., Gibson, J. J., Birks, S. J., Yi, Y., and Fawcett, P. J.: Terrestrial water fluxes dominated by transpiration, *Nature*, 496, 347–350, 2013.
- Jung, M., Reichstein, M., and Bondeau, A.: Towards global empirical upscaling of FLUXNET eddy covariance observations: validation of a model tree ensemble approach using a biosphere model, *Biogeosciences*, 6, 2001–2013, doi:10.5194/bg-6-2001-2009, 2009.
- Jung, M., Reichstein, M., Ciais, P., Seneviratne, S. I., Sheffield, J., Goulden, M. L., Bonan, G., Cescatti, A., Chen, J., and de Jeu, R.: Recent decline in the global land evapotranspiration trend due to limited moisture supply, *Nature*, 467, 951–954, 2010.
- Kalma, J., McVicar, T., and McCabe, M.: Estimating land surface evaporation: a review of methods using remotely sensed surface temperature data, *Surv. Geophys.*, 29, 421–469, 2008.
- Kelly, R. E., Chang, A. T., Tsang, L., and Foster, J. L.: A prototype AMSR-E global snow area and snow depth algorithm, *IEEE T. Geosci. Remote*, 41, 230–242, 2003.
- Koster, R. D., Sud, Y., Guo, Z., Dirmeyer, P. A., Bonan, G., Oleson, K. W., Chan, E., Verseghy, D., Cox, P., and Davies, H.: GLACE: the global land–atmosphere coupling experiment, Part I: Overview, *J. Hydrometeorol.*, 7, 590–610, 2006.

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

⏪

⏩

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Leblanc, M., Tweed, S., Van Dijk, A., and Timbal, B.: A review of historic and future hydrological changes in the Murray–Darling Basin, *Global Planet. Change*, 80–81, 226–246, doi:10.1016/j.gloplacha.2011.10.012, 2012.

Legates, D. R. and Willmott, C. J.: Mean seasonal and spatial variability in gauge-corrected, global precipitation, *Int. J. Climate*, 10, 111–127, doi:10.1002/joc.3370100202, 1990.

Liu, Y., Zhuang, Q., Pan, Z., Miralles, D., Tchebakova, N., Kicklighter, D., Chen, J., Sirin, A., He, Y., Zhou, G., and Melillo, J.: Response of evapotranspiration and water availability to the changing climate in Northern Eurasia, *Climatic Change*, 126, 413–427, doi:10.1007/s10584-014-1234-9, 2014.

Liu, Y. Y., de Jeu, R. A. M., McCabe, M. F., Evans, J. P., and van Dijk, A. I. J. M.: Global long-term passive microwave satellite-based retrievals of vegetation optical depth, *Geophys. Res. Lett.*, 38, L18402, doi:10.1029/2011GL048684, 2011.

Liu, Y. Y., Dorigo, W. A., Parinussa, R. M., De Jeu, R. A. M., Wagner, W., McCabe, M. F., Evans, J. P., and Van Dijk, A. I. J. M.: Trend-preserving blending of passive and active microwave soil moisture retrievals, *Remote Sens. Environ.*, 123, 1–18, 2012.

Lloyd, C. R., Gash, J. H. C., Shuttleworth, W. J., and de Marques, F. A. O.: The measurement and modelling of rainfall interception by Amazonian rain forest, *Agr. Forest Meteorol.*, 43, 277–294, 1988.

Luojus, K. and Pulliainen, J.: *Global Snow Monitoring for Climate Research: Snow Water Equivalent (SWE) Product Guide*, Helsinki, Finland, 2010.

Marin, C., Bouten, W., and Sevink, J.: Gross rainfall and its partitioning into throughfall, stemflow and evaporation of intercepted water in four forest ecosystems in western Amazonia, *J. Hydrol.*, 237, 40–57, 2000.

Martens, B., Miralles, D. G., Verhoest, N. E. C., Lievens, H., and Fernandez-Prieto, D.: Improving terrestrial evaporation estimates over continental Australia through assimilation of SMOS soil moisture, *Int. J. Appl. Earth Obs.*, in press, 2015.

McCabe, M. F., Miralles, D. G., Jiménez, C., Ershadi, A., Fisher, J. B., Mu, Q., Liang, M., Mueller, B., Sheffield, J., Seneviratne, S. I., and Wood, E. F.: Global scale estimation of land surface heat fluxes from space: product assessment and intercomparison, in: *Remote Sensing of Energy fluxes and Soil Moisture Content*, edited by: Petropoulos, G., Taylor and Francis CRC Press, 249–282, doi:10.1201/b15610-13, 2013.

McCabe, M. F., Ershadi, A., Jimenez, C., Miralles, D. G., Michel, D., and Wood, E. F.: The GEWEX LandFlux project: evaluation of model evaporation using tower-based and globally-



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[I◀](#)[▶I](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

gridded forcing data, *Geosci. Model Dev. Discuss.*, 8, 6809–6866, doi:10.5194/gmdd-8-6809-2015, 2015.

Miralles, D. G., Gash, J. H., Holmes, T. R. H., de Jeu, R. A. M., and Dolman, A.: Global canopy interception from satellite observations, *J. Geophys. Res.*, 115, D16122, doi:10.1029/2009JD013530, 2010.

Miralles, D. G., De Jeu, R. A. M., Gash, J. H., Holmes, T. R. H., and Dolman, A. J.: Magnitude and variability of land evaporation and its components at the global scale, *Hydrol. Earth Syst. Sci.*, 15, 967–981, doi:10.5194/hess-15-967-2011, 2011a.

Miralles, D. G., Holmes, T. R. H., De Jeu, R. A. M., Gash, J. H., Meesters, A. G. C. A., and Dolman, A. J.: Global land-surface evaporation estimated from satellite-based observations, *Hydrol. Earth Syst. Sci.*, 15, 453–469, doi:10.5194/hess-15-453-2011, 2011b.

Miralles, D. G., Teuling, A. J., van Heerwaarden, C. C., and Vilà-Guerau de Arellano, J.: Mega-heatwave temperatures due to combined soil desiccation and atmospheric heat accumulation, *Nat. Geosci.*, 7, 345–349, doi:10.1038/ngeo2141, 2014a.

Miralles, D. G., van den Berg, M. J., Gash, J. H., Parinussa, R. M., De Jeu, R. A. M., Beck, H. E., Holmes, T. R. H., Jiménez, C., Verhoest, N. E. C., Dorigo, W. A., Teuling, A. J., and Dolman, A. J.: El Niño–La Niña cycle and recent trends in continental evaporation, *Nat. Clim. Change*, 4, 122–126, 2014b.

Monteith, J. L.: Evaporation and environment, *Symp. Soc. Exp. Biol.*, 19, 205–234, 1965.

Moran, M. S., Scott, R. L., Keefer, T. O., and Emmerich, W. E.: Partitioning evapotranspiration in semiarid grassland and shrubland ecosystems using time series of soil surface temperature, *Agr. Forest Meteorol.*, 149, 59–72, doi:10.1016/j.agrformet.2008.07.004, 2009.

Mu, Q., Heinsch, F. A., Zhao, M., and Running, S. W.: Development of a global evapotranspiration algorithm based on MODIS and global meteorology data, *Remote Sens. Environ.*, 111, 519–536, doi:10.1016/j.rse.2007.04.015, 2007.

Mu, Q., Zhao, M., and Running, S. W.: Improvements to a MODIS global terrestrial evapotranspiration algorithm, *Remote Sens. Environ.*, 115, 1781–1800, 2011.

Mu, Q., Zhao, M., and Running, S. W.: MODIS Global Terrestrial Evapotranspiration (ET) Product (NASA MOD16A2/A3), Algorithm Theoretical Basis Document, Collection 5, NASA HQ, Numerical Terradynamic Simulation Group, University of Montana, Missoula, MT, USA, 20 November 2013.

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion



Mueller, B., Hirschi, M., and Seneviratne, S. I.: New diagnostic estimates of variations in terrestrial water storage based on ERA-Interim data, *Hydrol. Process.*, 25, 996–1008, doi:10.1002/hyp.7652, 2011a.

Mueller, B., Seneviratne, S. I., Jiménez, C., Corti, T., Hirschi, M., Balsamo, G., Ciais, P., Dirmeyer, P., Fisher, J. B., Guo, Z., Jung, M., Maignan, F., McCabe, M. F., Reichle, R., Reichstein, M., Rodell, M., Sheffield, J., Teuling, A. J., Wang, K., Wood, E. F., and Zhang, Y.: Evaluation of global observations-based evapotranspiration datasets and IPCC AR4 simulations, *Geophys. Res. Lett.*, 38, L06402, doi:10.1029/2010GL046230, 2011b.

Mueller, B., Hirschi, M., Jimenez, C., Ciais, P., Dirmeyer, P. A., Dolman, A. J., Fisher, J. B., Jung, M., Ludwig, F., Maignan, F., Miralles, D. G., McCabe, M. F., Reichstein, M., Sheffield, J., Wang, K., Wood, E. F., Zhang, Y., and Seneviratne, S. I.: Benchmark products for land evapotranspiration: LandFlux-EVAL multi-data set synthesis, *Hydrol. Earth Syst. Sci.*, 17, 3707–3720, doi:10.5194/hess-17-3707-2013, 2013.

Oki, T. and Kanae, S.: Global hydrological cycles and world water resources, *Science*, 313, 1068–1072, doi:10.1126/science.1128845, 2006.

Orellana, F., Verma, P., Loheide, I. I. S. P., and Daly, E.: Monitoring and modeling water-vegetation interactions in groundwater-dependent ecosystems, *Rev. Geophys.*, 50, RG3003, doi:10.1029/2011RG000383, 2012.

Parlange, M. B. and Katul, G. G.: An advection-aridity evaporation model, *Water Resour. Res.*, 28, 127–132, doi:10.1029/91wr02482, 1992.

Penman, H. L.: Natural evaporation from open water, bare soil and grass, *P. Roy. Soc. Lond. A*, 193, 120–145, 1948.

Priestley, C. and Taylor, R.: On the assessment of surface heat flux and evaporation using large-scale parameters, *Mon. Weather Rev.*, 100, 81–92, 1972.

Reichstein, M., Bahn, M., Ciais, P., Frank, D., Mahecha, M. D., Seneviratne, S. I., Zscheischler, J., Beer, C., Buchmann, N., Frank, D. C., Papale, D., Rammig, A., Smith, P., Thonicke, K., van der Velde, M., Vicca, S., Walz, A., and Wattenbach, M.: Climate extremes and the carbon cycle, *Nature*, 500, 287–295, doi:10.1038/nature12350, 2013.

Saha, S., Moorthi, S., Pan, H.-L., Wu, X., Wang, J., Nadiga, S., Tripp, P., Kistler, R., Woollen, J., Behringer, D., Liu, H., Stokes, D., Grumbine, R., Gayno, G., Wang, J., Hou, Y.-T., Chuang, H.-Y., Juang, H.-M. H., Sela, J., Iredell, M., Treadon, R., Kleist, D., Van Delst, P., Keyser, D., Derber, J., Ek, M., Meng, J., Wei, H., Yang, R., Lord, S., Van Den Dool, H., Kumar, A., Wang, W., Long, C., Chelliah, M., Xue, Y., Huang, B., Schemm, J.-K., Ebisuzaki, W., Lin, R.,

**The WACMOS-ET project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[I ◀](#)[▶ I](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

- Xie, P., Chen, M., Zhou, S., Higgins, W., Zou, C.-Z., Liu, Q., Chen, Y., Han, Y., Cucurull, L., Reynolds, R. W., Rutledge, G., and Goldberg, M.: The NCEP Climate Forecast System Reanalysis, *B. Am. Meteorol. Soc.*, 91, 1015–1057, doi:10.1175/2010BAMS3001.2, 2010.
- Sahoo, A. K., Pan, M., Troy, T. J., Vinukollu, R. K., Sheffield, J., and Wood, E. F.: Reconciling the global terrestrial water budget using satellite remote sensing, *Remote Sens. Environ.*, 115, 1850–1865, 2011.
- Savenije, H. G.: The importance of interception and why we should delete the term evapotranspiration from our vocabulary, *Hydrol. Process.* 18, 1507–1511, doi:10.1002/hyp.5563, 2004.
- Schlesinger, W. H. and Jasechko, S.: Transpiration in the global water cycle, *Agr. Forest Meteorol.*, 189–190, 115–117, doi:10.1016/j.agrformet.2014.01.011, 2014.
- Schlosser, C. A. and Gao, X.: Assessing evapotranspiration estimates from the second Global Soil Wetness Project (GSWP-2) simulation, *J. Hydrometeorol.*, 11, 880–897, doi:10.1175/2010JHM1203.1, 2010.
- Schneider, U., Becker, A., Finger, P., Meyer-Christoffer, A., Ziese, M., and Rudolf, B.: GPCP's new land surface precipitation climatology based on quality-controlled in situ data and its role in quantifying the global water cycle, *Theor. Appl. Climatol.*, 115, 15–40, doi:10.1007/s00704-013-0860-x, 2013.
- Seneviratne, S. I., Lüthi, D., Litschi, M., and Schär, C.: Land–atmosphere coupling and climate change in Europe, *Nature*, 443, 205–209, 2006.
- Seneviratne, S. I., Corti, T., Davin, E. L., Hirschi, M., Jaeger, E. B., Lehner, I., Orlowsky, B., and Teuling, A. J.: Investigating soil moisture–climate interactions in a changing climate: a review, *Earth Sci. Rev.*, 99, 125–161, 2010.
- Sheffield, J., Wood, E. F., and Roderick, M. L.: Little change in global drought over the past 60 years, *Nature*, 491, 435–438, 2012.
- Shuttleworth, W. J.: Evaporation from the Amazonian rainforest, *Philos. T. Roy. Soc. B*, 233, 321–346, 1988.
- Stackhouse, P. W., Gupta, S. K., Cox, S. J., Mikovitz, J. C., Zhang, T., and Chiacchio, M.: 12-year surface radiation budget dataset, *GEWEX News*, 14, 10–12, 2004.
- Su, Z., Dorigo, W., Fernández-Prieto, D., Van Helvoirt, M., Hungershofer, K., de Jeu, R., Parinussa, R., Timmermans, J., Roebeling, R., Schröder, M., Schulz, J., Van der Tol, C., Stammes, P., Wagner, W., Wang, L., Wang, P., and Wolters, E.: Earth observation Water

**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

Cycle Multi-Mission Observation Strategy (WACMOS), *Hydrol. Earth Syst. Sci. Discuss.*, 7, 7899–7956, doi:10.5194/hessd-7-7899-2010, 2010.

Su, Z., Roebeling, R., Schulz, J., Holleman, I., Levizzani, V., Timmermans, W., Rott, H., Mognard-Campbell, N., De Jeu, R., and Wagner, W.: Observation of Hydrological Processes using Remote Sensing, *Treatise on Water Science*, edited by: Wilderer, P., Academic Press, Oxford, 2, 351–399, 2011.

Teuling, A. J., Van Loon, A. F., Seneviratne, S. I., Lehner, I., Aubinet, M., Heinesch, B., Bernhofer, C., Grünwald, T., Prasse, H., and Spank, U.: Evapotranspiration amplifies European summer drought, *Geophys. Res. Lett.*, 40, 2071–2075, doi:10.1002/grl.50495, 2013.

Ubarana, V.: Observations and modelling of rainfall interception at two experimental sites in Amazonia, in: *Amazonian Deforestation and Climate*, edited by: Gash, J. H. C., Nobre, C. A., Robert, J. M., and Victoria, R. L., John Wiley, Chichester, UK, 151–162, 1996.

van Dijk, A. I. J. M., Beck, H. E., Crosbie, R. S., De Jeu, R. A. M., Liu, Y. Y., Podger, G. M., Timbal, B., and Viney, N. R.: The Millennium Drought in southeast Australia (2001–2009): natural and human causes and implications for water resources, ecosystems, economy, and society, *Water Resour. Res.*, 49, 1040–1057, doi:10.1002/wrcr.20123, 2013.

Vinukollu, R. K., Meynadier, R., Sheffield, J., and Wood, E. F.: Multi-model, multi-sensor estimates of global evapotranspiration: climatology, uncertainties and trends, *Hydrol. Process.*, 25, 3993–4010, doi:10.1002/hyp.8393, 2011a.

Vinukollu, R. K., Wood, E. F., Ferguson, C. R., and Fisher, J. B.: Global estimates of evapotranspiration for climate studies using multi-sensor remote sensing data: evaluation of three process-based approaches, *Remote Sens. Environ.*, 115, 801–823, doi:10.1016/j.rse.2010.11.006, 2011b.

Wang, K. and Dickinson, R. E.: A review of global terrestrial evapotranspiration: observation, modeling, climatology, and climatic variability, *Rev. Geophys.*, 50, RG2005, doi:10.1029/2011RG000373, 2012.

Wang, L., Good, S. P., and Caylor, K. K.: Global synthesis of vegetation control on evapotranspiration partitioning, *Geophys. Res. Lett.*, 41, 6753–6757, doi:10.1002/(ISSN)1944-8007, 2014.

Wang-Erlandsson, L., van der Ent, R. J., Gordon, L. J., and Savenije, H. H. G.: Contrasting roles of interception and transpiration in the hydrological cycle – Part 1: Temporal characteristics over land, *Earth Syst. Dynam.*, 5, 441–469, doi:10.5194/esd-5-441-2014, 2014.

# HESSD

12, 10651–10700, 2015

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[|◀](#)[▶|](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

- Wielicki, B. A., Barkstrom, B. R., Harrison, E. F., Lee III, R. B., Louis Smith, G., and Cooper, J. E.: Clouds and the Earth's Radiant Energy System (CERES): an earth observing system experiment, *B. Am. Meteorol. Soc.*, 77, 853–868, 2000.
- 5 Wild, M. and Liepert, B.: The Earth radiation balance as driver of the global hydrological cycle, *Environ. Res. Lett.*, 5, 025203, doi:10.1088/1748-9326/5/2/025003, 2010.
- Wild, M., Folini, D., Hakuba, M. Z., Schar, C., Seneviratne, S. I., Kato, S., Rutan, D., Ammann, C., Wood, E. F., and König-Langlo, G.: The energy balance over land and oceans: an assessment based on direct observations and CMIP5 climate models, *Clim. Dynam.*, 44, 3393–3429, doi:10.1007/s00382-014-2430-z, 2014.
- 10 Zhang, K., Kimball, J. S., Nemani, R. R., and Running, S. W.: A continuous satellite-derived global record of land surface evapotranspiration from 1983 to 2006, *Water Resour. Res.*, 46, W09522, doi:10.1029/2009WR008800, 2010.

The WACMOS-ET  
project – Part 2

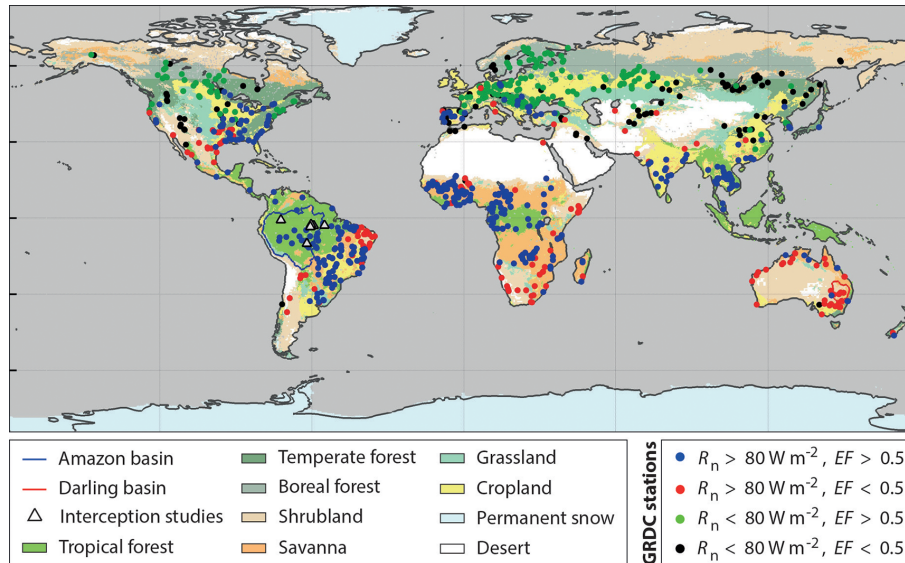
D. G. Miralles et al.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[I◀](#)[▶I](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)**Table 1.** Inputs from the reference input data set used in each of the models. The specific products chosen for each variable are also noted.

Input	Product	PM-MOD	GLEAM	PT-JPL
Radiation	SRB 3.1	✓	✓	✓
Air temperature	ERA-Interim	✓	✓	✓
Precipitation	CFSR-Land	–	✓	–
Soil moisture	CCI WACMOS	–	✓	–
Air humidity	ERA-Interim	✓	–	✓
Snow cover	GlobSnow/NSIDC	–	✓	–
Vegetation characteristics	Internally produced/vegetation optical depth from AMSR-E (see Sect. 2.2 and Part 1)	✓	✓	✓

The WACMOS-ET  
project – Part 2

D. G. Miralles et al.



**Figure 1.** Climatic regimes and biomes considered in the evaluations. The background map illustrates the land use classification scheme of the International Geosphere-Biosphere Programme (IGBP) used in Fig. 7. The Darling basin in southeastern Australia, as considered in Sect. 3.2, is contoured in red. The Amazon basin, as considered in Sect. 3.4, is marked in blue, with white triangles pointing at the location of past interception loss campaigns. Dots indicate the centroids of the 837 basins used in the analyses presented in Sect. 3.3.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

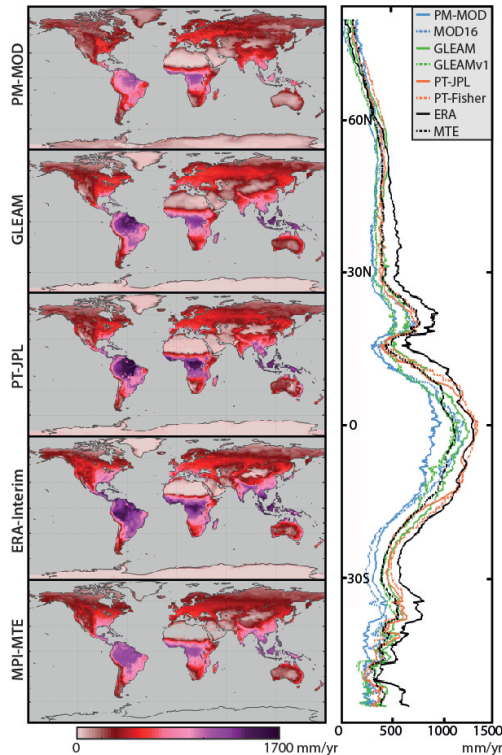
Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion





**Figure 2.** Mean patterns of land evaporation. Average evaporation during 2005–2007 for PM-MOD, GLEAM and PT-JPL forced by the reference input data set; the ERA-Interim reanalysis and MTE machine learning model are shown for comparison. On the left, the latitudinal profiles of evaporation; the original data sets of PM-MOD, GLEAM and PT-JPL (i.e. MOD16, GLEAMv1 and PT-Fisher, respectively) are also shown for comparison. We note that the original PT-JPL covers until 2006 only, and therefore its latitudinal profile is based on the 2005–2006 average. Due to MTE product not reporting values in polar regions and deserts, those areas are excluded from the latitudinal profiles in all models.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

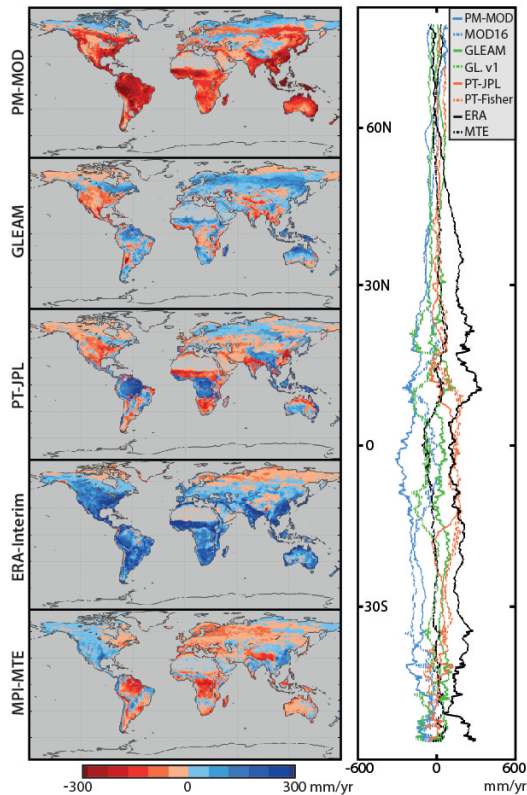
Full Screen / Esc

Printer-friendly Version

Interactive Discussion







**Figure 3.** Long-term anomalies of evaporation. Like Fig. 2 but based on the anomalies for each product calculated as the mean of each particular product (i.e. the maps in Fig. 2) minus the inter-product ensemble mean (considering the ensemble of five models). Grey areas over the continents correspond to regions where MTE displays no estimates of evaporation.

## The WACMOS-ET project – Part 2

D. G. Miralles et al.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

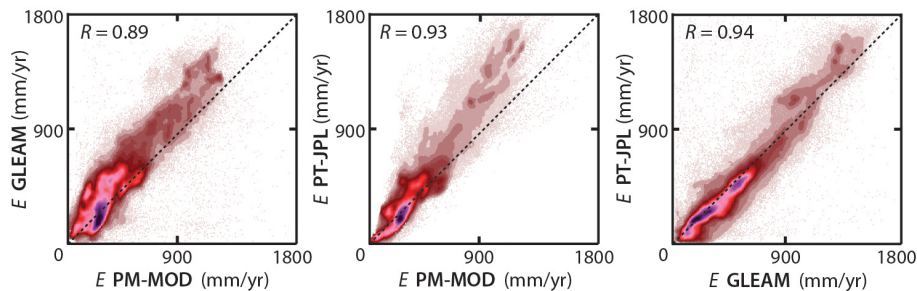
Printer-friendly Version

Interactive Discussion



**The WACMOS-ET  
project – Part 2**

D. G. Miralles et al.

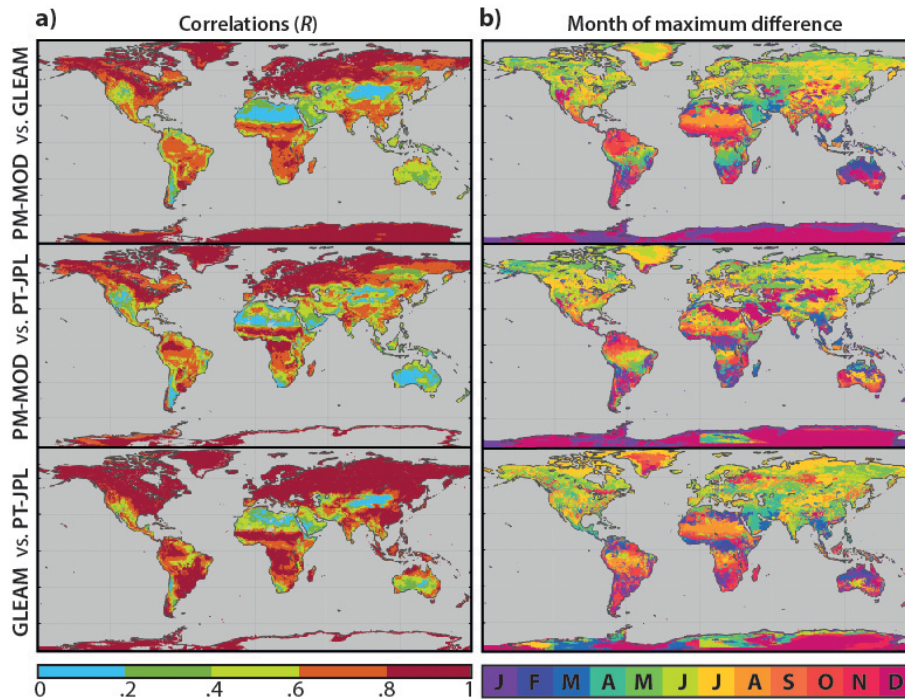


**Figure 4.** Correlations in the average spatial patterns for each pair of models. Each point represents a land pixel in Fig. 2. Pearson's correlation coefficients are listed.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[|◀](#)[▶|](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)

The WACMOS-ET  
project – Part 2

D. G. Miralles et al.



**Figure 5.** Temporal agreement between the models. **(a)** Month of the year in which the maximum (monthly) difference occurs between a particular pair of products based on their monthly climatologies. **(b)** Temporal correlation coefficients between each pair of products based on the daily (2005–2007) time series.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

I◀

▶I

◀

▶

Back

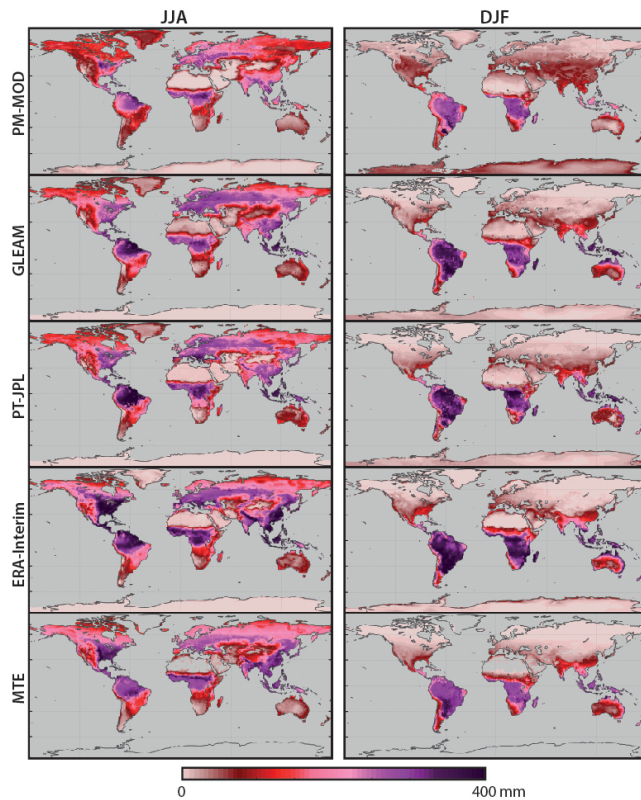
Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion





**Figure 6.** Mean seasonal differences. Average evaporation for PM-MOD, GLEAM and PT-JPL during boreal summer (June, July and August) and austral summer (December, January and February). ERA-Interim reanalysis and MTE are considered for comparison. The three years of data (2005–2007) are used in the calculation of these seasonal averages.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

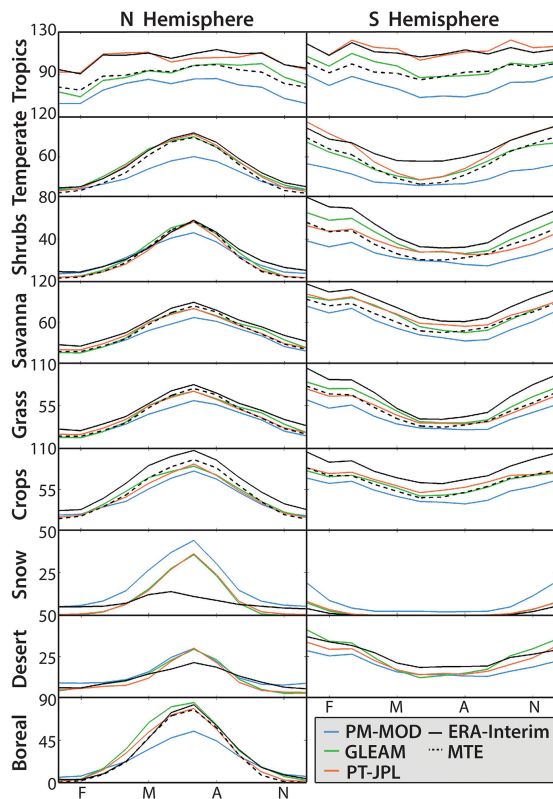
Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

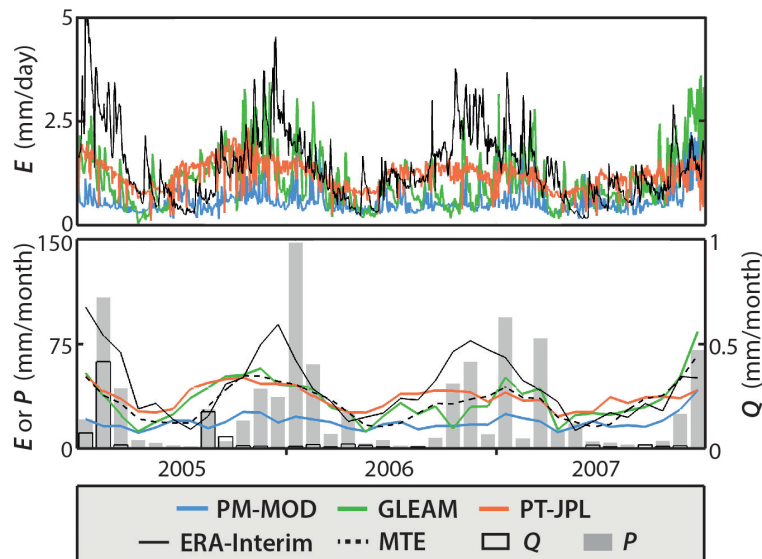




**Figure 7.** Average seasonal cycle. Monthly climatology of evaporation for each IGBP biome (see Fig. 1 for the global distribution of biomes) based on the 2005–2007 period. Northern Hemisphere (left panels) and Southern Hemisphere (right panels) are presented separately. In addition to the PM-MOD, GLEAM and PT-JPL results, the evaporation from ERA-Interim and MTE is also shown for completeness. Fluxes are displayed in  $\text{mm month}^{-1}$ .

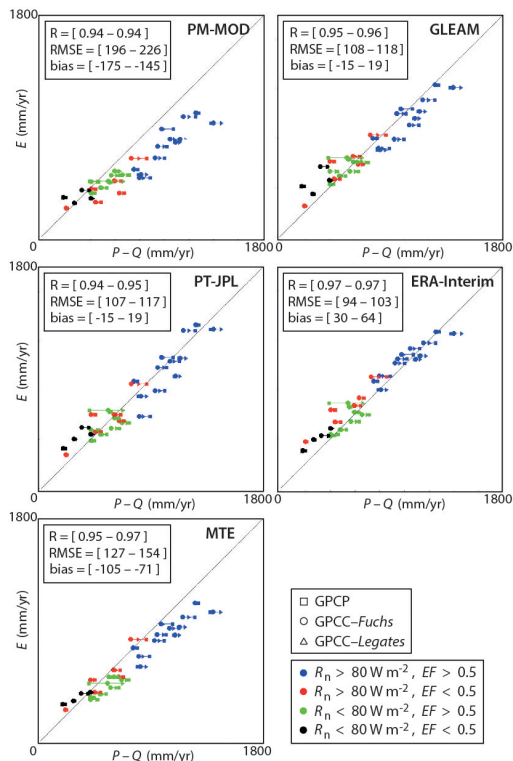
## The WACMOS-ET project – Part 2

D. G. Miralles et al.

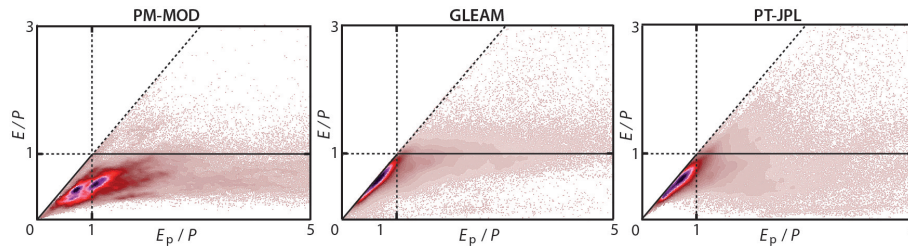


**Figure 8.** Evaporation during the Australian Millennium Drought. **(a)** Daily time series of evaporation from the three WACMOS-ET products for the Darling basin during 2005–2007. ERA-Interim evaporation is also illustrated for comparison. **(b)** Same as **(a)** but at monthly time scales, which enables to include the MTE (monthly) evaporation estimates. Precipitation anomalies from GPCP v6 with gauge correction factors from Fuchs et al. (2001), and discharge data from GRDC are also displayed. The contributing area is illustrated in Fig. 1.

[Title Page](#)
[Abstract](#)
[Introduction](#)
[Conclusions](#)
[References](#)
[Tables](#)
[Figures](#)
[⏪](#)
[⏩](#)
[◀](#)
[▶](#)
[Back](#)
[Close](#)
[Full Screen / Esc](#)
[Printer-friendly Version](#)
[Interactive Discussion](#)

**Figure 9.** Skill to close catchment water budgets. Correlations between the long-term averages in evaporation from the three WACMOS-ET models and  $P - Q$  estimates based on observations from 837 catchments. ERA-Interim and MTE are added for the sake of completeness. Three different precipitation products are considered in the calculation of  $P - Q$ : GPCP, GPCC v6 with gauge correction factors from Fuchs et al. (2001) and GPCC v6 with gauge correction factors from Legates and Willmott (1990). The corresponding validation statistics are noted within the scatterplots, and the range displayed for each statistical inference derives from the use of the three different precipitation products.



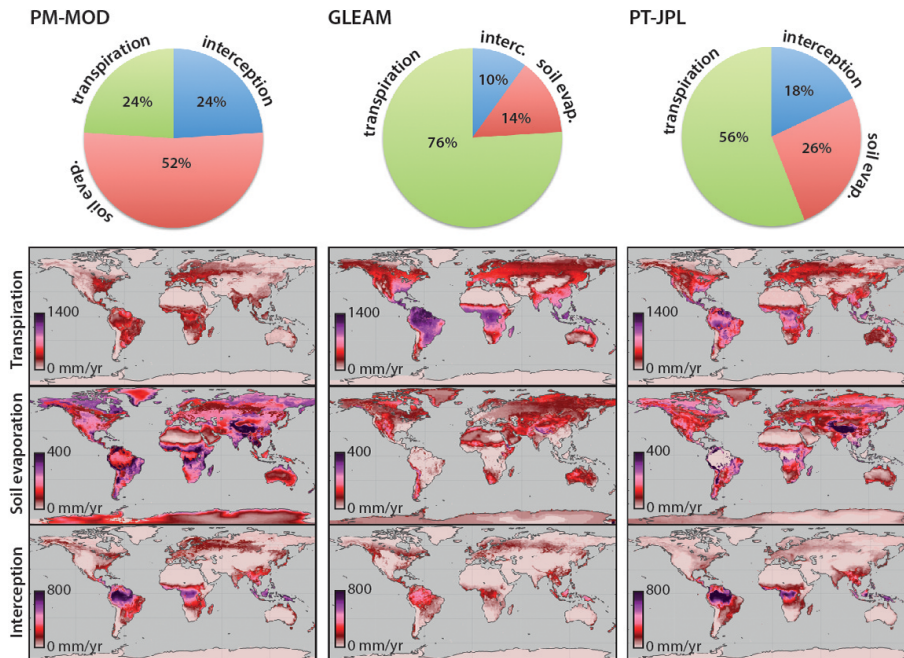
**Figure 10.** Budyko diagrams for the different models. Budyko curves derived for PM-MOD, GLEAM and PT-JPL. Each point represents a different land grid cell. The horizontal axis presents the ratio of potential evaporation to precipitation ( $E_p/P$ ) and the vertical axis presents the ratio of evaporation to precipitation ( $E/P$ ). Actual and potential evaporation estimates are derived by each of the models, while precipitation comes from GPCP v6 with gauge correction factors from Fuchs et al. (2001). Each land pixel is an independent scatter point.

[Title Page](#)[Abstract](#)[Introduction](#)[Conclusions](#)[References](#)[Tables](#)[Figures](#)[⏪](#)[⏩](#)[◀](#)[▶](#)[Back](#)[Close](#)[Full Screen / Esc](#)[Printer-friendly Version](#)[Interactive Discussion](#)



The WACMOS-ET  
project – Part 2

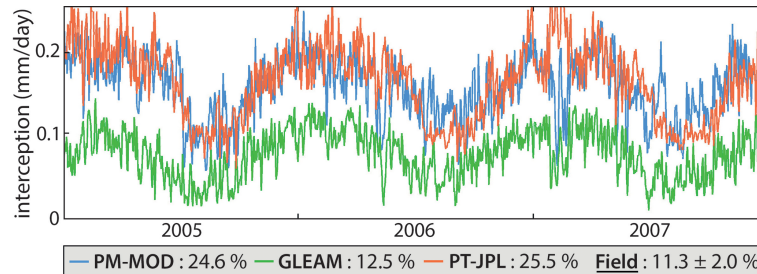
D. G. Miralles et al.



**Figure 11.** Partitioning evaporation. Maps indicate the average (2005–2007) transpiration, interception loss and bare-soil evaporation for each of the three WACMOS-ET models. Pie diagrams illustrate the global average contribution to total land evaporation from each component and product.

## The WACMOS-ET project – Part 2

D. G. Miralles et al.



**Figure 12.** Interception loss in Amazonia. Daily time series of interception (mm/day) for 2005–2007 from the three WACMOS-ET products as averaged for the entire Amazon basin. The average interception (as percentage of rainfall) from the three models is listed, together with the mean ( $\pm$  one standard deviation) of past field campaigns by Lloyd (1988) (8.9%), Czikowsky and Fitzjarrald (2009) (11.6%), Ubarana (1996) (11.6%), Cuartas et al. (2007) (13.3%), Marin et al. (2000) (13.5%), Shuttleworth (1988) (9.1%). See Fig. 1 for the Amazon catchment boundaries and the location of the field measurements.

Title Page

Abstract

Introduction

Conclusions

References

Tables

Figures

◀

▶

◀

▶

Back

Close

Full Screen / Esc

Printer-friendly Version

Interactive Discussion

