

# Derivation of Energy and Water Balance Parameters from ENVISAT AATSR Data across Savannah Volta Catchments in West Africa

## Second Space for Hydrology Workshop

12-14 November 2007 at WMO,  
Geneva, Switzerland

Stephen Opoku-Duah, Daniel N.M. Donoghue & Tim P. Burt  
*Department of Geography, Durham University*  
*Science Site, South Road*  
*Durham, DH1 3LE, UK*

Tel. (+) 44-191-334-1949; Tel. (+) 44-191-334-1801  
E-mail: [stephen.opoku-duah@durham.ac.uk](mailto:stephen.opoku-duah@durham.ac.uk)

**Abstract:** This paper is an attempt to derive energy and water balance parameters from the ENVISAT Level 1B Advanced Along-Track Scanning Radiometer (AATSR) data across savannah Volta catchments in West Africa as one of the solutions for scarce spatial data sets needed for hydrological modelling. This was achieved through solution of the radiation and energy balance equations, which were computationally-driven by the Surface Energy Balance Algorithm for Land (SEBAL) algorithm. The results showed that the AATSR sensor is a potentially good source of key geophysical parameters (e.g. NDVI, net radiation [ $R_n$ ], surface temperature [ $T_s$ ] and evapotranspiration [ET]) needed as inputs to regional hydrological models. A multiple regression analysis showed quite strong correlations between these parameters ( $R^2=0.61$ ;  $p<0.001$ ), which also compared well with published results over other semi-arid regions. However, comparison of AATSR estimates of ET with Landsat ETM+ and ground-based observations showed a wide deviation of about 2.0 mm day<sup>-1</sup>, which may be explained by differences in sensor calibration and spatial mismatch.

**Keywords:** Volta Savannah, Energy & Water Balance Parameters, AATSR, SEBAL

## INTRODUCTION

In Africa, the scarcity of spatial data needed for hydrological modelling makes derivation of energy balance parameters such as vegetation cover (e.g. NDVI), surface temperature ( $T_s$ ) and evapotranspiration (ET) from satellite sensors very important [1]. This is one of the principal objectives of the ESA TIGER Project (Space Applications for Water Management in Africa) which was initiated in 2002 as part of ESA's contribution to the UN goal on sustainable development of the continent (<http://www.tiger.esa.int>). In 2004, the ESA-Volta Project #2992 was started as part of the overall TIGER Initiative, one of the main objectives being assessment of the potential of ESA's Environmental Satellite (ENVISAT) Advanced Along-Track Scanning Radiometer (AATSR) Level 1B data as a potential source of spatially-derived energy balance parameters which may be used as inputs to new-generation hydrological models such as the modified Pitman model [2] across savannah catchments of the Volta basin. In the Volta basin (Fig 1), remote sensing data is important for two reasons: (1) spatially observed hydrometeorological data (needed for hydrological modelling) are very scarce because of the paucity of ground monitoring stations; and (2) the basin is very large (~400,000 km<sup>2</sup>) with extreme heterogeneous land cover, which makes accessibility and ground data collection a very difficult issue. In this context, coarse-resolution sensors such as the AATSR and NASA's Moderate Resolution Imaging Spectroradiometer (MODIS) remain the most tangible option to obtain or model energy balance parameters at the regional scale [3-7]. Recently, a number of papers have demonstrated for instance, the potential of the MODIS sensor as an attractive source of land surface information [5-7]. However, the derivation of energy balance variables from the AATSR sensor remains a key research issue. Although [3, 8] have previously derived  $T_s$  from AATSR over Spanish and Australian landscapes, the potential of the sensor over extremely heterogeneous savannah catchments in West Africa is yet to be determined. Also, there are no published papers on validation of energy balance variables over tropical areas. For example, papers that show validation of the AATSR reflectance bands are quite difficult to find. These are some the gaps this paper is intended to address. Specifically, the paper seeks to derive key components of the

energy balance equation, e.g. NDVI,  $T_s$  and ET over the Volta basin and examine their potential uses as inputs to hydrological models.

The paper is structured in the following way: the first part provides a description of the AATSR sensor data, followed by their application to the study area. The second part describes the study methods including a stepwise detail of image processing, derivation of key energy balance variables. This section also deals with data evaluation using a 30m resolution Landsat ETM+ image, ground data and published information. The third part discusses the results, which is followed by a summary of the key findings.

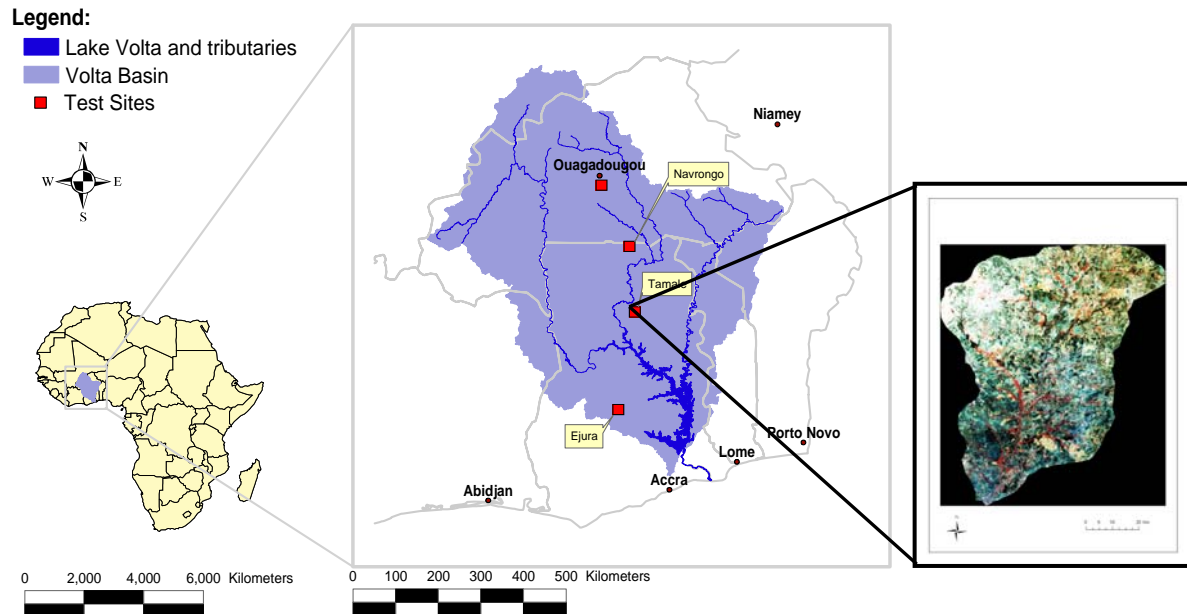


Fig 1 Location of the Volta river basin in West Africa Source: Modified after GLOWA-Volta Project [9]. The Tamale study areas is shown as the right-hand-side Landsat ETM+ image acquired on 5<sup>th</sup> January 2004; RGB=Band 4, 3, 2. The surface area of the Volta basin, the Volta Lake and the study area are 400,000, 8,500 and 5,300 km<sup>2</sup>, respectively.

## MATERIALS AND METHODS

### The Study Area

The study area covers the Tamale Volta catchment (see inset of Fig 1), whose landscape characteristics are quite representative of the Guinea savannah region in West Africa. The Volta basin encompasses six West African countries (Benin, Burkina Faso, La Côte d'Ivoire, Ghana and Mali) covering an area of about 400,000 km<sup>2</sup>. Over 70 million of West Africans depend on the Volta for food and water resources, housing, energy in terms of hydropower supply, and lake transport. The need to understand fluctuations in the key energy processes that control water availability in the region is therefore of utmost importance.

The climate of tropical West Africa is largely influenced by the movement of the Inter-Tropical Convergence Zone (ITCZ), which is an area of low pressure cells, where the Northeast Trade Winds meet the Southeast Trade Winds near the Earth's equator [10]. As these winds converge, moist air is forced upward causing water vapour to condense, and as the air cools and rises a band of heavy precipitation results. West Africa is also characterised by high daily/annual temperatures (~29<sup>0</sup> C), which are closely related to the region's position in terms of the Equator, Gulf of Guinea and Sahara desert. West Africa is largely drained by three transboundary river systems - the Niger, Senegal and Volta. The Volta Lake (~8,500 km<sup>2</sup>) developed from the Volta River (see Fig 1), forms a massive inland drainage and flow regulating system, whose hydrological conditions is central to the region's economy. The geology of the area is often valued in terms of rich mineral resources, but shallow aquifers also significantly contribute to the rural economy in terms of surface flow discharge and borehole water supply, particularly during the dry season [11].

## Data Sources

NASA's Landsat ETM+ and ESA's AATSR Level 1B imagery (Table 1) were used as the main sources of remotely sensed data [12]. It must be noted that Level 1B products do not directly contain images however; they contain calibrated data which are often used by other software applications to construct the images. A 40-year (1961-2000) record of daily air temperatures as well as historical (1970-1980) daily wind speed and sunshine data monitored from five widely spaced (>100 km apart) ground stations upstream the Volta Lake served as the main source of reference data [13]. It was difficult to obtain spatially observed surface temperature ( $T_s$ ) data for this research. However, the above data sets were complemented by energy flux (eddy correlation) data (Fig 2) measured for the Tamale district, courtesy of the GLOWA-Volta Project [9]. The brightly-coloured north-western section of the Landsat ETM+ image in Fig 1 largely covers the Tamale district. For purposes of validation, field surface temperatures were observed from thermal data loggers at the time of satellite overpass (Table 2). The thermal loggers named A-E were sited in the study area as follows: north-western (urban), north-eastern (grassland bush), central (agriculture), eastern (open woodland) and southern (closed woodland) locations of the study area (see inset of Fig 2).

Table 1 Characteristics of AATSR and MODIS data used for the study

| Image Date   | Satellite overpass (UTC) | Orbit | Track | Frame | Central coordinates |          |
|--------------|--------------------------|-------|-------|-------|---------------------|----------|
|              |                          |       |       |       | Lat                 | Lon      |
| AATSR Sensor |                          |       |       |       |                     |          |
| 040103       | 10:13:07 - 10:14:43      | 4441  | 380   | 3500  | 9° 51'N             | 1° 58'W  |
| 131104       | 10:04:47 - 10:06:23      | 14146 | 65    | 3500  | 9° 18'N             | 0° 04E   |
| 021204       | 10:07:35 - 10:09:11      | 14418 | 337   | 3500  | 9° 36'N             | 0° 35'W  |
| 181204       | 10:04:44 - 10:06:20      | 14647 | 65    | 3500  | 9° 19'N             | 0° 04'E  |
| 250105       | 10:10:25 - 10:12:01      | 15191 | 108   | 3500  | 9° 37'N             | 1° 18'W  |
| Landsat ETM+ |                          |       |       |       |                     |          |
| 050104       | 10:40:00 - 10:41:00      | -     | 194   | 53    | 10° 06'N            | 00° 36'W |

**Note:** The Landsat ETM+ scene acquired on 5<sup>th</sup> January 2004 was used mainly because of the absence of cloud-free data coincidental with the MODIS and AATSR overpass.

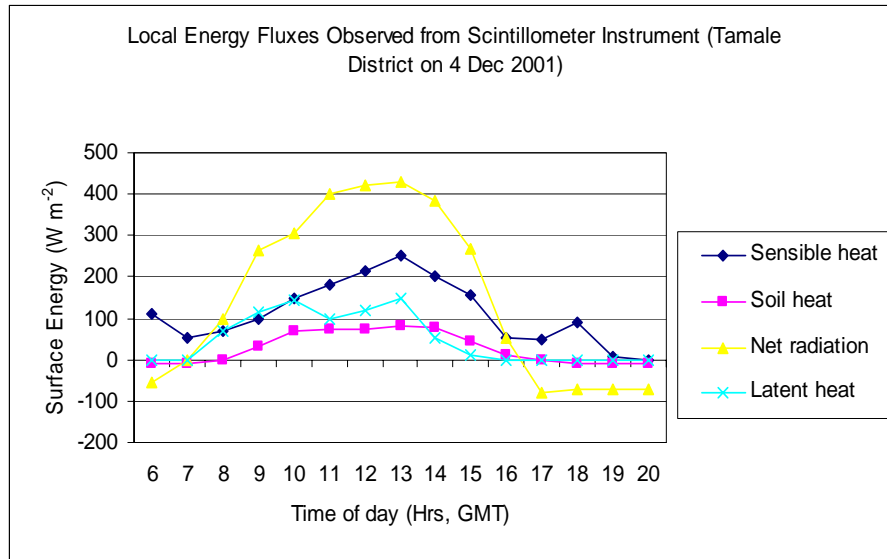


Figure 2 Local energy flux observations from the Dutch-type scintillometer instrument, which measures turbulent intensity fluctuations of the refractive index of air. **Source:** Reproduced from field data retrieved from the GLOWA-Volta database [9].

Table 2a Soil temperatures (K) observed from thermal data logger at the time of MODIS &amp; AATSR overpass.

|              | Logger A | Logger B | Logger C | Logger D | Logger E |
|--------------|----------|----------|----------|----------|----------|
| Date: 131104 |          |          |          |          |          |
| Time 10:12   | 309.19   | 310.21   | 309.19   | 308.72   | 307.58   |
| 10:32        | 309.27   | 310.32   | 309.97   | 308.86   | 307.97   |
| 11:12        | 309.27   | 310.29   | 309.92   | 308.45   | 308.49   |
| Av. Temp (K) | 309.24   | 310.29   | 309.69   | 308.68   | 307.95   |
| Date: 021204 |          |          |          |          |          |
| Time 10:12   | 312.67   | 312.08   | 312.39   | 308.11   | 307.88   |
| 10:32        | 312.98   | 312.21   | 312.33   | 308.07   | 307.70   |
| 11:12        | 312.98   | 312.29   | 312.38   | 308.64   | 308.66   |
| Av. Temp (K) | 312.88   | 312.19   | 312.37   | 308.27   | 308.08   |

The locations of the thermal loggers named as A-E are given in Table 3b

Table 2b Geographical locations of the thermal loggers

|          | Geographical description (see Fig 2) | Latitude ( $^{\circ}$ N) | Longitude ( $^{\circ}$ W) | Land cover class |
|----------|--------------------------------------|--------------------------|---------------------------|------------------|
| Logger A | North-west                           | 09 $^{\circ}$ 26'        | 00 $^{\circ}$ 51'         | Urban            |
| Logger B | North-east                           | 09 $^{\circ}$ 28'        | 00 $^{\circ}$ 26'         | Grassland-bush   |
| Logger C | Central                              | 09 $^{\circ}$ 14'        | 00 $^{\circ}$ 37'         | Agriculture      |
| Logger D | East                                 | 09 $^{\circ}$ 04'        | 00 $^{\circ}$ 28'         | Open Woodland    |
| Logger E | South                                | 08 $^{\circ}$ 56'        | 00 $^{\circ}$ 50'         | Closed Woodland  |

For regional-scale studies, the AATSR has very useful capabilities. For example, it provides data from both the reflectance and thermal infrared bands, which supplies useful land-based parameters such as land-cover and surface temperature, which are often needed as key inputs to energy and water balance models. In terms of temperature mapping, the AATSR scenes are supplied to users as a ready source of brightness temperatures [3]. This is extremely valuable because users can circumvent problems which are often associated with the calibration of (raw) radiance values such as the AVHRR and MODIS Level 1B data. It is also worth noting that the digital data structure of AATSR provides capabilities which easily lend it for integration with new-generation GIS-based data assimilation schemes [4]. Table 3 displays the general characteristics of the applied satellite data sets.

Table 3 Technical characteristics of key sensor data sets applied in this study

| Data source       | Spatial resolution (m)                             | Spectral range ( $\mu$ m)   |                     |  |   |
|-------------------|--|---|---------------------|--|---|
|                   |  | *VIS  | NIR band            | MIR band                               | TIR band  |
| Landsat ETM+      | 30 (15m for panchromatic and 60m for thermal band) | Band1 (0.45-0.52)<br>Band2 (0.52-0.60)<br>Band3 (0.63-0.69)<br>Pan (0.5-0.90) | Band4 (0.76-0.90)   | Band5 (1.55-1.75)<br>Band7 (2.08-2.35) | Band6 (10.4-12.50)  |
| ENVISAT AATSR L1B | 1 km   | Band1 (0.545-0.565)<br>Band2 (0.649-0.669)                                    | Band3 (0.855-0.875) | Band4 (1.580-1.640)                    | Band5 (3.50-3.89)<br>Band6 (10.40-11.30)<br>Band7 (11.50-12.50) |

Sources: Various NASA and ESA websites e.g. <http://daac.gsfc.nasa.gov/>; <http://www.msct.ssai.biz/>; <http://envisat.esa.int/instruments/>. \*VIS=Visible, NIR=Near Infrared, MIR=Middle Infrared & TIR=Thermal Infrared band

## Study Methods

The main image processing, modelling and data up-scaling methods are described below.

- The raw Level 1B AATSR images (Table 1) were first read using the Windows version of the European Space Agency (ESA) Basic ERS & ENVISAT AATSR and MERIS software (BEAM) (<http://www.brockmann-consult.de/beam/>). Brightness temperatures at the top of atmosphere ( $T_B$ ) were directly retrieved after running the BEAM software; the software automatically implements an inverted version of the Planck's equation where image radiances are converted to  $T_B$  [see (1)]. The  $T_B$  files were then exported and stored as GeoTIFF for further use.
- Examination of the Landsat ETM+ header files enabled the retrieval of calibration constants from the reflectance (Bands 1-5, 7, 8) and radiance (Band 6) files of the composite product. The reflectance and radiance values were then used to calculate calibrated versions of time series data following NASA's re-calibration procedures described in an online manual. The inverted Planck's equation was then applied to convert the image radiances (L) of each of the thermal infrared bands (TIR) to  $T_B$  following the approach of [14] as:

$$T_B = \frac{c_2}{\lambda \ln[c_1 / \lambda^5 L + 1]} \quad (1)$$

where  $c_1 = 3.74 \times 10^8$  and  $c_2 = 1.439 \times 10^4$  and  $\lambda$  = wavelengths of the TIR band.  $T_B$  was subsequently used to calculate  $T_s$  using the split-window algorithm and empirical coefficients derived by [7] as:

$$T_s = 0.39T_1^2 + 2.34T_1 - 0.78T_1 * T_2 - 1.34T_2 + 0.39T_2^2 + 0.56 \quad (2)$$

- Further, ERDAS spatial modelling tools were used to calculate NDVI (normalized difference vegetation index) for time series imagery using the equation below [15]:

$$NDVI = (NIR - R) / (NIR + R) \quad (3)$$

where  $NIR$  and  $R$  are light reflectance in the near infrared band and the red bands of the electromagnetic spectrum, respectively. The data generated from (1-3) were applied as key inputs to the Surface Energy Balance Algorithm for Land (SEBAL) code [16, 17] which was run through MATLAB software interface. The theoretical basis of the SEBAL is that it solves the energy and radiation balance equations (4) & (5) on per pixel basis, from which ET may be derived as the residual term of the regional energy balance model at the time of satellite overpass.

$$ET = R_n - H - G_0 \quad (4)$$

where  $ET$  = latent heat flux (evaporation),  $R_n$  = net radiation,  $H$  = sensible heat flux, and  $G_0$  = soil heat flux. The units for all the above parameters are  $Wm^{-2}$ . Following (4), the net radiation ( $R_n$ ), which is the amount of radiation left after all outgoing radiation ( $L^\uparrow$ ) is subtracted from all incoming radiation ( $L_\downarrow$ ), was calculated as follows:

$$R_n = K_\downarrow (1 - \alpha) + (L_\downarrow - L^\uparrow) \quad (5)$$

where  $K_\downarrow$  = incoming shortwave radiation,  $\alpha$  = albedo (dimensionless) and  $L_\downarrow$  and  $L^\uparrow$  are incoming and outgoing long wave radiation, respectively and the shortwave radiation ( $Wm^{-2}$ ) reaching the Earth's surface under cloud-free conditions. The procedure for calculating  $R_n$  intermediate parameters, model assumptions and physical constants applied in this study are already detailed in [7]. Also, empirical models used for calculating soil heat ( $G_0$ ), sensible heat ( $H$ ) and daily evapotranspiration ( $ET_{day}$ ) and their assumptions are fully described by [16, 17].

## RESULTS AND DISCUSSION

### Results

The scarcity of spatially observed ground data is a major concern for hydrological modelling in the Volta basin. Table 1 presents energy flux results derived from AATSR, which may be used as intermediate data inputs for hydrological models. The results are compared with other data sets.

Table 4 Energy fluxes derived from ENVISAT-AATSR data

| Energy fluxes                | AATSR | Landsat<br>ETM+ | Observed<br>(Tamale) | Deviation<br>(AATSR) | Deviation<br>(Landsat) |
|------------------------------|-------|-----------------|----------------------|----------------------|------------------------|
| Net Radiation ( $R_n$ )      | 378   | 352             | 304                  | -74                  | -48                    |
| Sensible heat ( $H$ )        | 300   | 208             | 150                  | -150                 | -58                    |
| Latent heat ( $\lambda ET$ ) | 68    | 134             | 142                  | +74                  | +8                     |
| Soil heat ( $G_0$ )          | 24    | 51              | 71                   | +47                  | +21                    |

NDVI (surrogate for land cover), surface temperature ( $T_s$ ) and evapotranspiration ( $ET$ ) are the most influential parameters which drive the energy/water balance model [7]. Figs 3 & 4 show  $T_s$  and  $ET$  models derived from the AATSR sensor and how they compare with other satellite sensors and ground data.

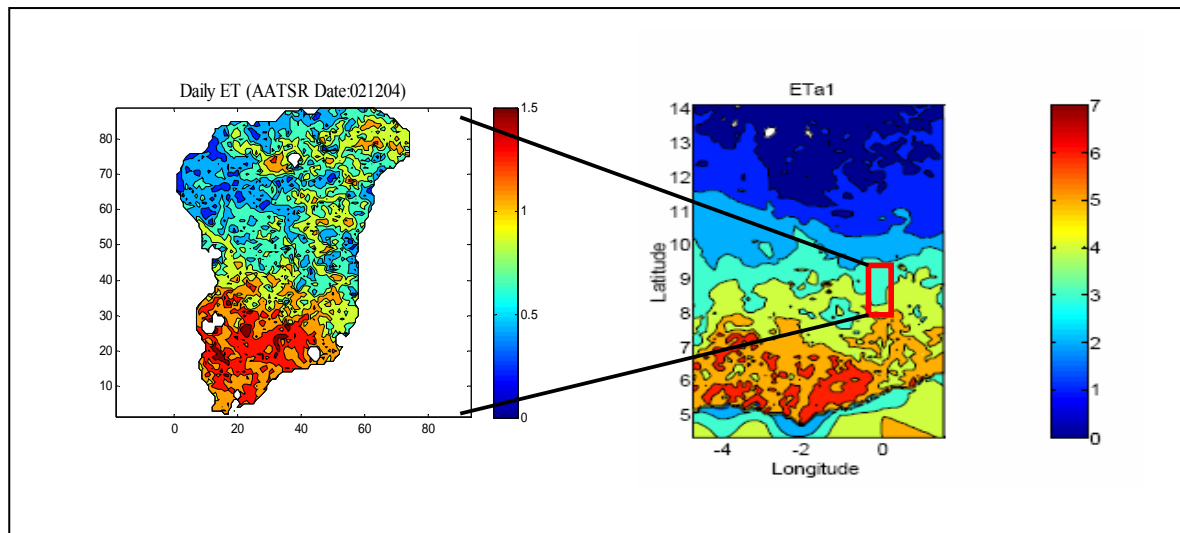


Fig 3 Spatial ET derived from AATSR data

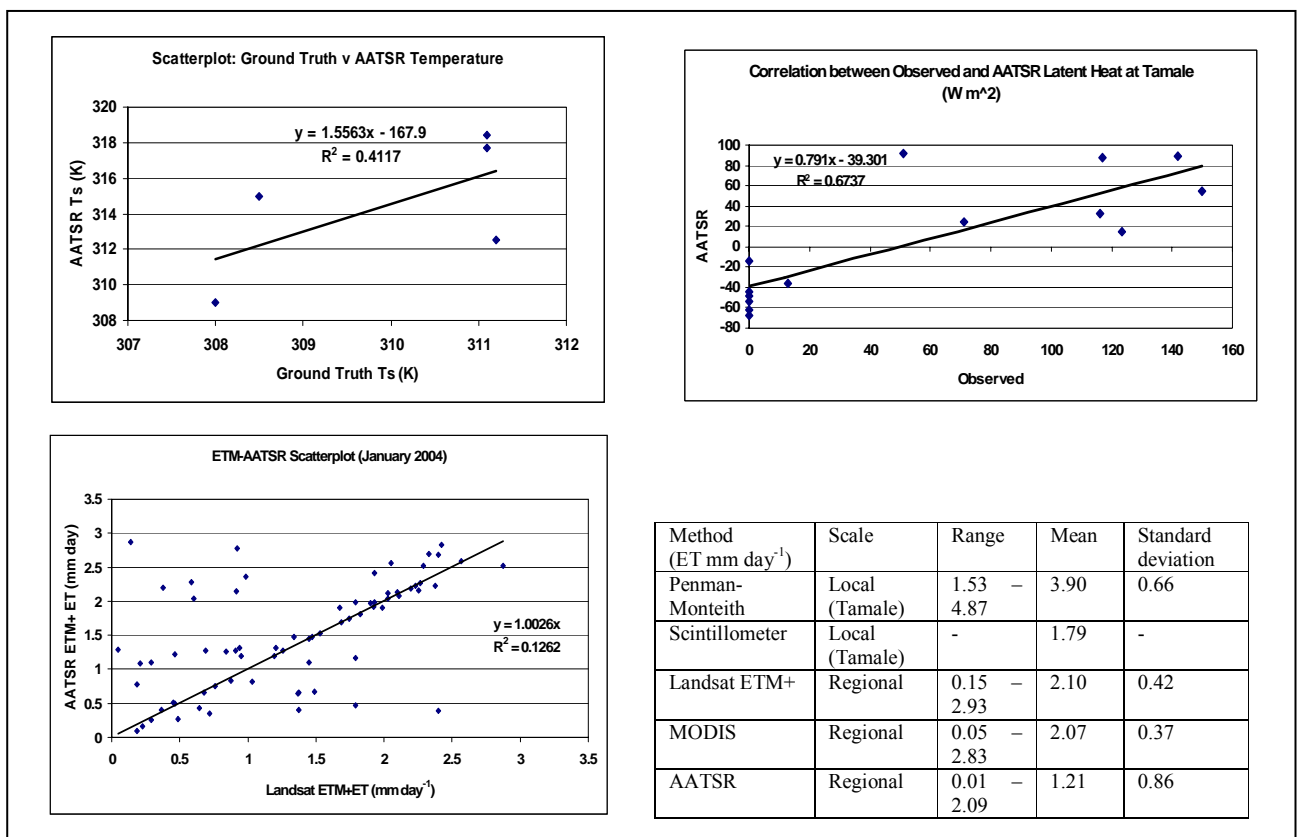


Fig 4 Comparison of  $T_s$  and ET estimates derived from AATSR

## Discussion

The results shown in Table 4 and Figs 3 & 4 tend to show that  $T_s$  estimates by the AATSR sensor are higher than ground temperatures (HOBO thermal probes) ( $R^2 = 0.44$ ). Aside  $T_s$ , ET models are driven by related parameters such as NDVI,  $R_n$ ,  $r_{ah}$  [5, 7]. In this case, the interactive effect of NDVI,  $T_s$  and  $R_n$  seems to be most important ( $R^2 = 0.61$ ;  $p < 0.001$ ) [7]. In terms of ET, there was poor spatial correlation ( $R^2 = 0.13$ ) between the 1-km pixel AATSR and the 30-m Landsat ETM+ data. When the AATSR was compared with ground ET observations, there was also an error margin of  $\sim 2.0 \text{ mm day}^{-1}$ , which was somewhat similar to previous findings by [5, 7]. The observed differences may be explained in two ways: (1) differences in sensor calibration; and (2) spatial mismatch between satellite and ground

observations. Indeed, there are no easy and accurate methods for comparing satellite measurements with ground information. Also, ground-based temperatures and satellite radiometric temperatures are not the same and may only be compared for the sake of practicality [18].

## CONCLUSION

Although the AATSR was originally designed to measure sea surface temperature, hence, not well calibrated over land targets, its initial estimates of ET and other energy balance parameters over the Volta basin in Ghana are quite promising. In this context, the spatial correlation between AATSR L1B and Landsat ETM+ was found to be poor ( $R^2 = 0.13$ ), however, this may be explained by differences in sensor calibration. Further work needs to be done using the improved AATSR L2 product to see whether the current results could be improved.

## Acknowledgements

We wish to sincerely thank ESA for their ENVISAT-AATSR data through the ESA/UNESCO Volta TIGER Project #2992. The research fellowship provided by the Government of Ghana for the principal author to complete his Ph.D. at Durham University (UK) is also greatly appreciated.

## REFERENCES

- [1] Washington, R., Harrison, M., Conway, D., Black, E. et al. African climate change: Taking the shorter route. *BAMS*, Oct. 2006, 1355-1365.
- [2] Hughes, D.A., Andersson, L., Wilk, J. & Savenije, H.H.G. Regional calibration of the Pitman model for the Okavango River. *J. Hydrology*, 2006, 331, 30-42.
- [3] Soria, G. & Sobrino, J.A. AATSR derived land surface temperature from heterogeneous areas, *Proc. ESA's ENVISAT MERIS-AATSR workshop 2005*, Frascati, Italy, 6pp. <http://envisat.esa.int>
- [4] Prata, F. *Land surface temperature measurement from space: AATSR algorithm* – Theoretical basis document. Technical Report: 2002, CSIRO, Canberra, Australia, pp 1-34.
- [5] Brata, N., Islam, S., Venturini, V., Bisht, G., & Jiang, L. Estimation and comparison of evapotranspiration from MODIS and AVHRR sensors for clear sky days over the Southern Great Plains, *Remote Sens. Environ.*, 2006, 103, 1-15.
- [6] Bisht, G., Venturini, V., Jiang, L. & Islam, S. Estimation of the net radiation using MODIS data for clear-sky dates. *Remote Sensing of Environment* 2005, 97, 52-97.
- [7] Opoku-Duah, S. Remote Sensing of Energy and Water Fluxes over Volta Savannah Catchments in West Africa, *Unpublished Ph.D. Thesis*: 2007, Durham University, UK, pp 123-222.
- [8] Sobrino, J.A., Soria, G. & Prata, A.J. Surface temperature retrieval from Along Track Scanning Radiometer-2 data: Algorithms and validation, *Journal of Geophysical Research*, 2004, 109, D1101, doi: 10.1029/2003JD004212.
- [9] ZEF (Centre for Development Research) *Ecology and Development Series: GLOWA-Volta Project, 1999-2005*, Cuvellier Verlag, Göttingen, 2004: pp 1-138.
- [10] Nicholson, S.E. & Grist, J.P. A conceptual model for understanding rainfall variability in the West African Sahel interannual and interdecadal timescales, *Int. J. Climatol.*, 2001, 21, 1733-1757.
- [11] Ayibotele, N.B. Regional hydrology and water resources in the African humid tropics. In *Hydrology and water management in the humid tropics*, Bonnel, M., Hufschmidt, M. M. & Gladwell, J. S. Eds.; University Press: Cambridge, 1993; pp 112-134.
- [12] MODIS Characterization Support Team (MCST) *MODIS LUT Information Guide For Level 1B*, MCST Internal Memorandum # M1036, December 1, 2003. The latest release is available on-line at <http://www.mcst.ssa.gov/mcstweb/L1B/product.html>
- [13] Ghana Meteorological Services Department *Daily rainfall and temperature records over the Volta basin in Ghana*, 1961-2000, July 2004.
- [14] Price, J.C. Land surface temperature measurements from split window channels of the NOAA-7 Advanced Very High Resolution Radiometer, *J. Geophys. Res.* 89 (D5), 1984, 7231-7237.
- [15] Goetz, S. J. Multi-sensor analysis of NDVI, surface temperature and biophysical variables at a mixed grassland site. *Int. J. Remote Sensing* 1987, 18 (1), 71-94.
- [16] Bastiaanssen, W.G.M., Menenti, M., Feddes, R.A. & Holtslag, A.A.M. A remote sensing surface energy balance algorithm for land (SEBAL) – Part 1: Formulation. *J. Hydrology* 1998, 228, 198-212.
- [17] Bastiaanssen, W.G.M., Pelgrum, H., Wang, J. Ma, J., Moreno, J., Roerink, G.J. & Van Der Wal, T. (1998) The Surface Energy Balance Algorithm for Land (SEBAL): Part 2 validation, *J. Hydrology* 1998, 228, 213-229.
- [18] Sabins, F. F. *Remote Sensing: Principles and Interpretation*, W. H. Freeman & Co.: New York, 1987, pp 21-82.