# Spaceborne GNSS-Reflectometry for ocean winds: First results from the UK TechDemoSat-1 mission

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This article has been accepted for publication and undergone full peer review but has not been through the copyediting, typesetting, pagination and proofreading process, which may lead to differences between this version and the Version of Record. Please cite this article as doi: 10.1002/2015GL064204

First results are presented for ocean surface wind speed retrieval from reflected GPS signals measured by the Low-Earth-Orbiting UK TechDemoSat-1 satellite (TDS-1). Launched in July 2014, TDS-1 provides the first new spaceborne Global Navigation Satellite System-Reflectometry (GNSS-R) data since the pioneering UK-Disaster Monitoring Mission experiment in 2003. Examples of onboard-processed delay Doppler Maps reveal excellent data quality for winds up to 27.9 m/s. Collocated ASCAT scatterometer winds are used to develop and evaluate a wind speed algorithm based on Signal-to-Noise ratio (SNR) and the Bistatic Radar Equation. For SNR greater than 3 dB, wind speed is retrieved without bias and a precision around 2.2 m/s between 3-18 m/s even without calibration. Exploiting lower SNR signals however requires good knowledge of the antenna beam, platform attitude and instrument gain setting. This study demonstrates the capabilities of low-cost, lowmass, low-power GNSS-R receivers ahead of their launch on the NASA CYGNSS constellation in 2016.

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### 1. Introduction

GNSS-Reflectometry (GNSS-R) is an innovative Earth Observation technique that exploits signals of opportunity from Global Navigation Satellite System (GNSS) constellations after reflection on the Earth surface. In brief, navigation signals from GNSS transmitters such as those of the Global Positioning System (GPS) are forward-scattered off the Earth surface in the bistatic specular direction. Dedicated GNSS-R receivers on land, airborne or spaceborne platforms detect and cross-correlate the reflected signals with direct signals from the same GNSS transmitter to provide geophysical information about the reflecting surface. An excellent comprehensive review of the GNSS-R technique was produced recently by *Zavorotny et al.* [2014].

GNSS-R can provide geophysical information about a number of surface properties, its applications to Earth Observation including remote sensing of ocean roughness, soil moisture, snow depth and sea ice extent (see for example *Gleason* [2006]; *Cardellach et al.* [2011]). The exploitation of GPS signals for ocean scatterometry was first proposed by *Hall and Cordey* [1988] and the first collection and tracking of reflected GPS navigation signals from an aircraft took place in July 1991 (*Auber et al.* [1994]). In 1993, *Martin-Neira* [1993] proposed for the first time to use GPS reflectometry for mesoscale altimetry. Applications to ocean remote sensing have received by far the most attention to date, with many more studies focussed on the retrieval of sea surface height (e.g. *Lowe et al.* [2002]; *Ruffini et al.* [2004]; *Nogues-Correig et al.* [2010]; *Carreno-Luengo et al.* [2013]) and ocean surface wind speed or mean square slope (e.g. *Garrison et al.* [1998]; *Rius et al.* [2002]; *Komjathy et al.* [2004]; *Katzberg et al.* [2006]; *Clarizia et al.* [2009]). GNSS-

R ocean roughness data can also contribute to better ocean salinity retrieval by providing better correction for sea state effects (e.g. *Valencia et al.* [2011]). This paper focuses on the wind speed retrieval capability of GNSS-R.

The interest in GNSS-R for ocean wind monitoring stems primarily from the low-cost, low-mass, low-power characteristics of GNSS-R receivers, which could lead to affordable multi-satellite constellations able to deliver dramatically improved space/time sampling to complement existing ocean surface wind observations. With large and growing numbers of GNSS surface reflections available simultaneously at any point and time from GPS and other GNSS constellations (e.g. GLONASS, Galileo, Beidou,...), the technique also offers the possibility of wide-swath sensing given appropriate receiver and antenna specifications. Finally, GNSS-R uses GNSS L-band microwave signals (~1.5 GHz, around 20 cm wavelength) which are less sensitive to atmospheric attenuation by precipitation than higher microwave frequencies and could therefore yield more robust wind estimates in heavy rain conditions.

While the literature reports many land-based and airborne GNSS-R experiments, there has been until now only limited spaceborne GNSS-R data. To gauge the potential of GNSS-R for improved global sampling, the technique needs to be convincingly demonstrated from LEO altitudes. Initial proof-of-concept from LEO was achieved in 2003/2004 with the pioneering GNSS-R experiment by Surrey Satellite Technology Ltd on the UK-Disaster Monitoring Mission (UK-DMC). About 50 separate data acquisitions were performed over the ocean (*Gleason* [2006]), although only a handful ever became available to the wider community for analysis (*Gleason and Gebre-Egziabher* [2009]; *Clarizia et al.* 

[2009]). Ultimately, even the complete UK-DMC GNSS-R ocean dataset is insufficient to provide a statistically robust assessment of the capabilities of GNSS-R from LEO altitude. The situation changed radically following the successful launch by SSTL on 8 July 2014 of the UK TechDemoSat-1 satellite and its GNSS-R payload.

This paper gives an overview of the GNSS-R experiment on TechDemoSat-1 and of the large GNSS-R dataset acquired over the global ocean since 1 September 2014. Examples are shown of the onboard-processed delay Doppler Maps (DDMs) collected in different wind conditions, revealing excellent quality of the reflected signals for winds up to 27.9 m/s. The paper then presents an SNR-based inversion algorithm developed for the retrieval of ocean surface wind speed and preliminary validation results of TDS-1 wind speed against collocated wind measurements from the METOP ASCAT satellites. The final section highlights the specific technical constraints affecting GNSS-R wind retrieval on TDS-1 and indicates future work needed to fully demonstrate the wide-swath capabilities of the technique.

## 2. GNSS-R on TechDemoSat-1

The TechDemoSat-1 satellite was successfully launched on 8 July 2014 from the Baikonur launch site onboard a Soyuz launch vehicle. TDS-1 is a UK-funded technology demonstrator satellite which carries eight experimental payloads including the Space GNSS Receiver Remote Sensing Instrument (SGR-ReSI). The ReSI is a precursor of the GNSS-R receivers to be flown on the NASA Cyclone Global Navigation System Satellite (CYGNSS; *Ruf et al.* [2012]) constellation of 8 micro-satellites due for launch in late 2016. The ReSI is a small (~300x160x30 mm), low-mass (~1.5 kg), low-power (~10 watts)

receiver based on commercial off-the-shelf components. Full details about TDS-1 and the ReSI can be found in *Jales and Unwin* [2015].

The TDS-1 satellite was placed into orbit at an altitude around 635 km with an inclination of 98.4°. The orbit is quasi sun-synchronous with a local time ascending node (LTAN) drift of 1.42 hour per year. The TDS-1 orbital elements are available from NO-RAD Celestrak with identifier "TDS 1" 40076. Satellite attitude knowledge comes from an on-board Kalman filter that takes inputs from magnetometers and sun-sensors. Attitude knowledge error is estimated to be around 1° in the non-eclipsed part of the orbit and around 10° when the satellite is in eclipse.

The satellite is controlled and operated from the ground station with a strict eight-day duty cycle shared between the eight experimental payloads. The ReSI can be accessed and operated for only 2 days in every 8-day cycle. The baseline operation of the ReSI is for continuous acquisition of delay Doppler maps (DDMs) generated onboard at 1 Hz with a coherent integration time of 1 ms. Although integration parameters of the onboard DDM processing are re-programmable, this capability has not been exploited so far.

The ReSI collects GPS L-band L1 Coarse Acquisition signals using a highly directional downward pointing antenna with a peak gain of 13.3 dBi and a 3 dB half-beamwidth of 15°. The main lobe of the antenna is pointing 6° from the vertical behind the spacecraft. The ReSI is able to track, record and process reflected signals simultaneously from 4 separate GPS transmitters (identified by their individual Pseudo Random Noise (PRN) codes). An onboard ranking computation selects the four best specular reflections based on the closest proximity to the maximum gain of the receiver antenna.

The ReSI instrument can operate in two re-programmable receiver gain modes: unmonitored automatic gain control (uAGC) or fixed gain mode (FGM). All ReSI data acquired up to 5 February 2015 were obtained in uAGC mode. While there are plans for acquisitions in FGM in future, for the time being, in the absence of receiver gain data, analyses are limited to uAGC mode signals.

# 3. TDS-1 ReSI Data Collections

The first scientific data acquisition with TDS-1 ReSI took place on 1 September 2014. Since then, the ReSI has collected data at regular intervals, the volume of data collected in each duty cycle increasing steadily with time. As of 5 February 2015, the ReSI had acquired 3500 independent tracks across all GPS PRN, corresponding to over 1.5 million onboard processed 1 Hz DDMs. The largest dataset collected so far in one day represents approximately 20 hours of data. Figure 1 shows the geographical distribution of the TDS-1 ReSI data acquired over the ocean between 1 September 2014 and 5 February 2015 across all PRN. Colours represent the collocated wind measurements obtained from the METOP/ASCAT-A or ASCAT-B satellite scatterometers.

The matchup criteria between the ReSI specular points and ASCAT-A/B were set to allow a maximum separation of 1° of latitude/longitude and 1 hour. ASCAT wind speed data were taken from Level 1B Swath products with a resolution of 25 km, available from the Physical Oceanography Distributed Active Archive Center (https://podaac.jpl.nasa.gov/). Standard ASCAT data quality flags were applied, including rain flags, in order to avoid any potentially rain-contaminated ASCAT wind data in the subsequent assessment of TDS-1 GNSS-R winds. Fortuitously, the TDS-1 orbit at

the start of the mission was particularly favourable to collocation with ASCAT-A/B, with almost 70% of all ReSI data over the ocean finding a suitable matchup with at least one of ASCAT-A or ASCAT-B within 1° and 1 hour.

Figure 2 shows two examples of 1 Hz DDMs processed onboard, obtained on two separate occasions with wind speed of 3 m/s (according to collocated ASCAT data) but different values of antenna gain at the specular point (AGSP). The dimensions (resolution) of the DDMs are 128 bins in delay (0.25 chip spacing) and 20 bins in Doppler frequency (500 Hz spacing). The DDMs show the expected "horseshoe" shape characteristic of spaceborne GNSS-R correlated power over the ocean, with the DDM peak corresponding to the area around the specular point on the ocean surface. Since TDS-1 was operating in uAGC mode, absolute power levels are unknown. One observes nevertheless the very significant effect on peak power levels of the AGSP, as well as the asymmetry in the DDM associated with the modulation of the correlated power by the antenna pattern.

The highest wind speed encountered so far was observed in the Atlantic Sector of the Southern Ocean on 31 October 2014 when collocated ASCAT data reported winds up to 27.9 m/s. The 1Hz DDM corresponding to these high wind conditions is shown in Figure 3. Even without calibration, it is easy to see that the DDM is much broader and power levels are much lower at high winds due to increased scatter away from the forward-scattering direction towards the receiver. Nevertheless, Figure 3 convincingly demonstrates that TDS-1 ReSI was able to detect GPS reflected signals and maintain good data quality and integrity even in those high wind conditions.

#### 4. Wind Speed Inversion and the Bistatic Radar Equation

Many methods and algorithms have been proposed in the literature to retrieve ocean surface roughness, wind speed or sea state from GNSS-R measurements (see for example *Zavorotny et al.* [2014], *Clarizia et al.* [2014], *Marchan-Hernandez et al.* [2010] among others and the references therein). In this paper, a wind inversion algorithm is proposed based on the DDM correlated power around the specular point and the GNSS-R Bistatic Radar Equation (BRE).

The BRE encapsulates the dependence of the GNSS-R DDM on rough ocean properties (Zavorotny and Voronovich [2000]; Gleason [2006]) as:

$$\langle |Y(\tau,f)|^2 \rangle = \frac{P_t G_t \lambda^2 T_i^2}{(4\pi)^3} \iint_A \frac{G_r \Lambda^2(\tau) S^2(f)}{R_t^2 R_r^2} \sigma^0 dA \tag{1}$$

where  $\langle |Y(\tau, f)|^2 \rangle$  is the ensemble mean of the correlation power as a function of the time delay  $(\tau)$  and the frequency offset (f),  $P_t$  and  $G_t$  are the GPS transmitter power and antenna gain,  $\lambda$  is the carrier wavelength (L-band),  $T_i$  is the coherent integration time,  $G_r$  is the receiver antenna pattern,  $R_t$  and  $R_r$  are respectively the transmitter-tosurface and surface-to-receiver ranges,  $\Lambda^2$  and  $S^2$  are the components of the Woodward Ambiguity Function in delay (triangular function) and Doppler frequency (sinc function) respectively, dA is the surface element of the scattering area A, and  $\sigma^0$  is the Normalised Bistatic Radar Cross Section (NBRCS). With some simplifying assumptions, Equation 1 can be re-written so that:

$$\langle \sigma^0 \rangle = K P_r \left[ \iint_A \frac{G_r \Lambda^2(\tau) S^2(f)}{R_t^2 R_r^2} dA \right]^{-1}$$
(2)

where  $\langle \sigma^0 \rangle$  represents the average  $\sigma^0$  associated with the received power,  $P_r$ , for surface area A and K is a constant equal to  $\frac{P_t G_t \lambda^2 T_i^2}{(4\pi)^3}$ . The simplifying assumptions leading to Equation 2 are:

1.  $\sigma^0$  is constant over the area A and can be taken out of the integral in Equation 1. 2. Differences in  $P_t$  and  $G_t$  for different GPS PRN are second order effects, so that  $P_t$  and  $G_t$  can be assumed constant to a first approximation.

Clearly, the second assumption neglects the known differences in the direct signal strength of different GPS transmitters, but at present the direct signal levels are not available from the TDS-1 datasets. In addition, there will be intermittent fluctuations in the signal strength of the reflected signals due to atmospheric effects (e.g. scintillation). These secondary terms are also overlooked at this stage but will need to be addressed in the future.

The content of the square brackets in Equation 2 is determined entirely by the geometry of the bistatic scattering at the specular point and has to be computed numerically. The numerical computation accounts for the velocities and positions of the transmitter and receiver, the attitude of the receiver platform and the projected receiver antenna pattern on the surface. Clearly, uncertainties in platform attitude will directly impact the antenna gain at the specular point, and therefore  $\sigma^0$ .

In contrast, the term  $P_r$  is estimated from the measured DDM. Here,  $P_r$  is computed from the Signal-to-Noise ratio (SNR) of the correlated power around the specular point. SNR is calculated as the ratio of the average signal power (S) in a box located around the peak of the DDM, and the average noise power (N) measured in a noise box in the signal-

free area of the DDM. Minor variants of the definition of the SNR make little difference to the final results. The sizes of the signal and noise boxes are fixed. The noise box spans all Doppler bins and 4 delay bins starting from the first delay available in the DDM. The size of the signal box determines the surface area (A) that contributes to the measured power, and therefore the spatial resolution of the measurement. Here, the dimensions of the signal box are chosen to achieve a spatial resolution close to that of ASCAT, namely 25 km. The dimensions of the signal box were 1 chip (4 delay bins) by 1500 Hz (3 Doppler bins) corresponding to a spatial resolution between 22 and 30 km (median value 25 km) depending on the elevation angle of the specular point. Since the position of the peak fluctuates in both delay and Doppler space (for example due to changes in the range to the Earth surface), the signal box is positioned dynamically around the peak using an automatic peak detection scheme. The automatic peak detection is based on the application of a median filter and extraction of the local maxima in the DDM.

5. Geophysical Model Function and Early Validation Against ASCAT Winds In reality, the ReSI SNR cannot be equated directly with  $P_r$  since the measured SNR is also affected by other effects including changes in system noise levels, speckle noise, the receiver instrument gain setting (which is unknown when ReSI operates in uAGC mode) and fluctuations in signal strength due to atmospheric effects (for example, amplitude scintillation caused by irregularities in electron density in the ionosphere; see e.g. *Dubey et al.* [2005]). The original purpose of the AGC is to automatically adjust the GNSS receiver gain to make optimal use of the available dynamic range and enable the detection of even low power signals. While this feature is desirable to ensure signal detection, it

introduces an unknown factor in the DDM power levels which could obscure the relationship between SNR and ocean roughness. One way of minimising these unknown effects is to limit analyses, in the first instance, to high SNR signals when the impact is likely to be less pronounced. This is the approach adopted here whereby the ReSI/ASCAT matchup dataset is reduced to include only ReSI reflections for which the SNR  $\geq 3$  dB (an arbitrary threshold corresponding to signals for which the peak power is more than twice the noise level).

The effect of the 3 dB SNR threshold is to remove some high wind samples and to reject specular points obtained outside the main lobe. Focusing on data in the main lobe of the antenna, where AGSP gradients are smallest, also has the advantage of reducing the sensitivity to possible attitude errors. The remaining matchup dataset is much reduced, to about 20% of the original collocated dataset, but nevertheless counts 7514 data points retained for analysis. The retained dataset is further divided into a randomly selected Training set (75% of samples) used for the development of the Geophysical Model Function (GMF) and a Validation set (25% of samples) reserved for retrieval performance assessment.

Figure 4a shows the relationship observed with the Training set between the (uAGC mode) ReSI  $\sigma^0$  and the collocated ASCAT wind speed. Colours indicate data density relative to the distribution peak. The data cloud clearly shows GNSS-R  $\sigma^0$  decreasing rapidly with increasing wind speed, in a manner that is reminiscent of the behaviour of nadir altimeter  $\sigma^0$  against wind speed (see for example *Gommenginger et al.* [2002], *Abdalla* [2012] and references therein). Here, we find that the behaviour is well captured

in the first instance by a simple function of the form  $U_{10} = Ae^{B\sigma^0} + C$ , shown as a grey line in Figure 4a. Using ordinary least-square fit, the values of A, B and C are 676.0, 0.4097 and 1.622 respectively. Figure 4b presents the TDS-1 ReSI retrieved wind speed obtained by applying the GMF in Figure 4a to the Validation set. The retrieved wind speed is unbiased (bias = 0 m/s) and reports a root-mean-square error of 2.2 m/s.

## 6. Summary and Conclusions

First results were presented of ocean surface wind speed retrieval from reflected GPS signals collected by the UK TechDemoSat-1 satellite launched in July 2014. The extensive dataset of new spaceborne GNSS-R observations collected since 1 September 2014 was described, with examples of onboard processed delay Doppler Maps that demonstrate excellent data quality from low-earth-orbit for wind speed up to 27.9 m/s. A wind speed retrieval algorithm based on the Bistatic Radar Equation and the Signal-to-Noise ratio was developed and validated against collocated ASCAT wind speed. Analyses were restricted to GPS reflections with SNR greater than 3 dB to mitigate the unknown impact of other factors affecting power levels on the relation between the measured GNSS-R signals and ocean wind speed. The ReSI uAGC mode  $\sigma^0$  showed a rapidly decreasing behaviour against wind speed, similar to the relation seen for satellite nadir altimeters. Even without calibration and potentially large satellite attitude errors, the preliminary Geophysical Model Function presented in this paper leads to retrieved TDS-1 wind speeds that are unbiased with root-mean-square errors of 2.2 m/s for winds between 3 and 18 m/s.

This study represents the first comprehensive in-orbit demonstration of the GNSS-R technique and confirms the capability of low-cost low-mass low-power GNSS-R receivers

such as ReSI to contribute significantly to global ocean surface wind monitoring from lowearth-orbit altitudes. The findings give new strength to the prospect of affordable satellite constellations to deliver necessary improvements in spatio-temporal sampling of weather systems in combination with existing satellite wind data. However, full demonstration of the wide-swath capabilities of spaceborne GNSS-R was not possible due to insufficient knowledge about the TDS-1 satellite attitude and other factors linked to instrument behaviour and power level fluctuations. Future work will focus on reducing uncertainties linked to satellite attitude and antenna gain at the specular point that should yield further improvements in wind speed retrieval performance. More work is needed also to understand and manage the origins of observed power fluctuations, thereby enabling the assessment and exploitation of low SNR signals and make it possible to establish the wide-swath capability of the technique.

Acknowledgments. This work was made possible thanks to funding and support from the European Space Agency (Contract No. 4000109726/13/NL/FF/lf), the UK Centre for Earth Observation Instrumentation and NERC National Capability at the National Oceanography Centre. The TechDemoSat-1 data used in this paper is available at no cost from http://www.merrbys.co.uk.

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Figure 1. Geographical distribution of TDS-1 GNSS-R data acquired over the ocean between 1 September 2014 and 6 February 2015. Colour indicates the wind speed measured by ASCAT (A or B, whichever is closest) within 1 hour and 1° of latitude/longitude of the TDS-1 data. Standard ASCAT flags are applied. Data affected by sea ice are removed by limiting analyses to ocean data at latitudes below 55°.

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**Figure 2.** Two examples of TDS-1 ReSI onboard-processed 1 Hz delay Doppler Maps obtained for a wind speed of 3 m/s (according to collocated ASCAT data) for two values of Antenna Gain at the Specular Point (AGSP), namely a) 13.3 dBi (at the peak of the main lobe) and b) 7.2 dBi (at -6 dB from the peak gain)

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Figure 3. TDS-1 ReSI onboard-processed 1 Hz delay Doppler Map obtained for a wind speed of 27.9 m/s (according to collocated ASCAT data) in the Atlantic sector of the Southern Ocean on 31 October 2014



Figure 4. a) TDS-1 ReSI uAGC mode Sigma0 versus collocated ASCAT wind speed for SNR  $\geq$  3dB for the Training dataset, showing (in grey) the preliminary GMF of the form  $U_{10} = Ae^{B\sigma^0} + C$  with values of A, B and C equal to 676.0, 0.4097 and 1.622 respectively; b) TDS-1 ReSI wind speed retrieved with the BRE algorithm versus collocated ASCAT winds for the Validation dataset. This example validation dataset yields bias and RMSE values of 0.004 m/s and 2.213 m/s respectively and is statistically representative of the overall BRE retrieval performance.

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