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- 10 Comparison of free high-resolution digital elevation data sets (ASTER GDEM2,
- 11 SRTM v2.1/v4.1) and validation against accurate heights from the Australian
- 12 National Gravity Database
- 13
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- 20
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- 22

## 23 ABSTRACT

Today, several global digital elevation models (DEMs) are freely available on the web. This study compares and evaluates the latest release of the *Advanced Spaceborne Thermal Emission Reflectometer* DEM (ASTER GDEM2) and two DEMs based on the *Shuttle Radar Topography Mission* (SRTM) as released by the *United States Geological Survey* (SRTM3 USGS version 2.1) and by the

28 *Consortium for Spatial Information* (SRTM CGIAR-CSI version 4.1) over the Australian continent.

29 The comparison generally shows a very good agreement between both SRTM DEMs, however, data 30 voids contained in the USGS model over steep topographic relief are filled in the CGIAR-CSI model. 31 ASTER GDEM2 has a northeast- to southwest-aligned striping error at the 10 m level and shows an 32 average height bias of -5 m relative to SRTM models. The root-mean square (RMS) height error 33 obtained from the differences between ASTER GDEM2 and SRTM over Australia is found to be around 34 9.5 m. An external validation of the models with over 228,000 accurate station heights from the 35 Australian National Gravity Database allows estimating each models' elevation accuracies over 36 Australia: ASTER GDEM2 ~ 8.5 m, SRTM3 USGS ~ 6 m, SRTM CGIAR-CSI ~ 4.5 m (RMS). In addition, the 37 dependence of the DEM accuracy on terrain type and land cover is analysed. Applying a cross-38 correlation image co-registration technique to 529 1 x 1 degree tiles and 138 2 x 2 degree tiles reveals 39 a mean relative shift of ASTER GDEM2 compared with SRTM of -0.007 and -0.042 arc-seconds in 40 north–south and –0.100 and –0.136 arc-seconds in east–west direction over Australia, respectively.

- 41 KEYWORDS: digital elevation model, DEM evaluation, ASTER GDEM2, SRTM3 USGS v2.1, SRTM
- 42 CGIAR-CSI v4.1, Australian National Gravity Database, elevation accuracy, georeferencing

#### 43 INTRODUCTION

44 Accurate models of the topography are important from a scientific as well as from a socio-economic 45 point of view. In science, digital elevation models (DEMs) play a crucial role, e.g. for navigation, 46 hydrology, gravity field modelling, geology and other Earth-related disciplines (e.g. Forsberg 1984; 47 Müller-Wohlfeil et al. 1996). A society can benefit from the scientific advances based on widespread, 48 reliable topographic information, e.g. from precise flood prediction and management (McLuckie & 49 NFRAC 2008) or local-scale weather forecasts (Truhetz 2010). Today, elevation data over Australia's 50 landmass is either available from point-wise terrestrial observation techniques (e.g. conventional 51 levelling or GPS (Global Positioning Sytem)/levelling) or air- or satellite-borne sensors (e.g. RADAR (Farr 52 et al. 2007), LIDAR (Zwally et al. 2002), stereoscopic photogrammetry (Abrams et al. 2002)). The latter 53 techniques are capable of providing height information in terms of homogeneous, equally gridded 54 digital elevation models. Many parts of Australia are rather flat with only about 6% of the landmass 55 exceeding elevations of 600 m; mountainous terrain is only found over few regions of the continent, 56 such as Australia's eastern highlands and the Great Dividing Range. These circumstances and the fact 57 that a large part of the continent is not or only little vegetated (~ 40%) are beneficial for creating 58 accurate topography models from space- or airborne sensors, as they favour a direct line-of-sight to 59 bare ground.

60 Apart from the Australian national topographic model GEODATA DEM-9S (version 3) (Carroll & Morse 61 1996), a number of open access (global) digital elevation models exist that describe the topography of 62 Australia. Various DEMs over Australian territory have been compared and validated to develop 63 reliable accuracy estimates. Hilton et al. (2003) compared five pre-SRTM-era (Shuttle Radar 64 Topography Mission; Farr et al. 2007) DEMs with the Australian GEODATA DEM-9s (version 1) and 65 validated all models using ERS-1 satellite altimeter-derived topographic heights. More recently Hirt et 66 al. (2010) compared three DEMs, namely ASTER GDEM (version 1), the SRTM DEM release (version 67 4.1) by the Consortium for Spatial Information of the Consultative Group for International Agricultural 68 Research (CGIAR-CSI) and GEODATA DEM-9S (version 3), and evaluated them using 6392 levelling and 69 911 GPS/levelling ground control points.

70 In this study, three DEMs, namely SRTM3 version 2.1 released by United States Geological Survey 71 (USGS), the SRTM model released by CGIAR-CSI (version 4.1) and ASTER GDEM2 (version 2), are 72 compared and evaluated against a large and for DEM-evaluation little-used ground truth data set. The 73 data set contains station heights from the Australian National Gravity Database and provides a much 74 larger set of ground truth points than previously used (e.g. Hirt et al. 2010). Covering various regions 75 of the Australian continent, the data set allows further study of the DEM accuracy as a function of a) 76 terrain type, and b) ground cover. The ground cover model used here is a generalised version of ESA's 77 (European Space Agency) GlobeCover map (Bontemps et al. 2011), which is reduced to three land cover 78 types. By including CGIAR-CSI in this evaluation, we are able to directly compare our results to the 79 study by Hirt et al. (2010), who evaluate the data over Australian territory. Further, our study provides 80 new information about both SRTM data sets in Australia (e.g. its performance over different types of 81 land cover). The second version of ASTER GDEM is reported to have improved significantly with respect 82 to its predecessor, e.g. in terms of vertical height bias, striping error and voids over Australia that have 83 been filled to some extent (Krieger et al. 2010; Carabajal 2011; Gesh et al. 2011; Tachikawa et al. 84 2011b). We assess whether ASTER GDEM2 can be considered as a serious alternative to the SRTM 85 models over Australia.

In this paper all the elevation data used in this study are reviewed. Firstly, the three global DEMs under evaluation are described and results from previous studies on their performance are briefly summarised. Secondly, the ground truth data set (the Australian National Gravity Data Base) is presented and analysed regarding its positioning accuracy. The different models are compared and validated against the ground truth data. The vertical accuracy of the DEMs is assessed as a function 91 Table 1: Chronological list of the latest versions of currently freely available global digital elevation models. NOAA: National
 92 Oceanic and Atmospheric Administration; EROS: Earth Resources Observation and Science Center.

Model	Full model name	Resolution [arc-secs]	Institution /Reference, Date of release		
SRTM CGIAR-	Shuttle Radar Topography Mission release by the Consortium for Spatial Information (version 4.1)	3	CGIAR-CSI, 2011		
ASTER GDEM2	Advanced Spaceborne Thermal Emission and Reflection Radiometer Global Digital Elevation Model (version 2)	1	METI /ERSDAC, NASA/USGS,		
ETOPO1	1 Arc-Minute Global Relief Model	60	NOAA, 2009		
ACE2 GDEM	Altimeter Corrected Elevations (version 2) Global Digital Elevation Model	3	Berry et al., 2008		
SRTM3 / DTED1	Shuttle Radar Topography Mission 3 arc-seconds (version 2.1)/ Digital Terrain Elevation Data (level 1)	3	NASA/USGS NGA, 2005		
SRTM30 /	Shuttle Radar Topography Mission 30 arc-seconds (version 2.1) / Digital Terrain Elevation Data (level 0)	30	NASA/USGS NGA, 2005		
ACE GDEM	Altimeter Corrected Elevations Global Digital Elevation Model	30	Berry et al., 2000		
GLOBE	Global Land One-km Base Elevation Digital Elevation Model	30	NOAA, 1999		
GTOPO30	Global 30 Arc-Second Elevation	30	EROS / USGS, 1996		

93

of terrain type and land cover and the horizontal accuracy is investigated by means of a cross correlation image co-registration technique. Finally, the results are summarised and an outlook on
 future work and future DEMs is given.

#### 97 ELEVATION DATA OVER AUSTRALIA

#### 98 Global Digital Elevation Models

99 Today, a number of freely-available digital elevation data sets exist on a global scale. The International 100 DEM Service (IDEMS) of the International Association of Geodesy (IAG) currently lists six freely available global 101 DEMs: SRTM, ASTER, ACE, ACE2, GLOBE, GTOPO30 102 (http://www.cse.dmu.ac.uk/EAPRS/iag/index.html, site accessed September 2013). This compilation, 103 however, is incomplete as it omits several SRTM-based DEM releases. Furthermore, there are different 104 name conventions and different versions of each release. SRTM-based DEM releases by the National 105 Geospatial-Intelligence Agency (NGA, former NIMA) are named Digital Terrain Elevation Data (DTED) 106 whereas USGS SRTM releases are simply named SRTM, both followed by a suffix-number, which 107 indicates the spatial resolution of the DEM. Table 1 summaries a list of currently freely available global 108 DEMs together with their latest version number (when applicable) in chronological order. Note that 109 ETOPO1 and ACE2 also incorporate SRTM data.

110 The DEMs differ in terms of global coverage, ground resolution, vertical accuracy, geolocation 111 accuracy, meta-information, treatment of inland water bodies and treatment of no-data values (voids). 112 The differences among the models are related to the underlying acquisition techniques and 113 observation platforms as well as to the modelling techniques/algorithms applied. Further, there exist 114 two categories of DEMs, namely *digital terrain models* (DTMs) and *digital surface models* (DSMs). The 115 first represent elevations of the bare ground, while the latter provides surface heights, including the 116 tops of buildings and vegetation canopy. By virtue of the observation techniques used, most DEMs

#### 117 (e.g. ASTER and SRTM) are DSMs or mixed DSM/DTMs rather than pure representations of the terrain 118 (DTMs).

v4.1. JPL: Jet Propulsion Laboratory; WGS84: World Geodetic System 1994; EGM96: Earth Gravitational Model 1984.

	ASTER GDEM2	SRTM3 USGS v2.1	SRTM CGIAR-CSI v4.1
Satellite Mission	Terra	Shuttle Radar	Shuttle Radar
		Topography Mission	Topography Mission
Institutions	METI, NASA	NASA, USGS, JPL	CGIAR-CSI
Instrument	ASTER (optical)	Space Shuttle Radar	Space Shuttle Radar
		C / X-band SAR	C/ X-band SAR
Height Reference	WGS84 / EGM96	WGS84 / EGM96	WGS84 / EGM96
Height Type	Orthometric Heights	Orthometric Heights	Orthometric Heights
Coverage	+83 N to -83 S latitude	+60 N to -56 S latitude	+60 N to -56 S latitude
Resolution	30 m / 1 arc-second	90 m / 3 arc-seconds	90 m / 3 arc-seconds
Elevation Accuracy	< 17 m	< 16 m	< 16 m
	(at 95 % confidence)	(at 90 % confidence)	(at 90 % confidence)
Download	http://gdem.ersdac.	http://dds.cr.usgs.gov/srtm/	http://srtm.csi.cgiar.org
	jspacesystems.or.jp/	version2 1/SRTM3	

## 121

122 In the following, three prominent DEM (actually DSM) releases, namely ASTER-GDEM2, SRTM3 v2.1

123 (USGS) and SRTM v4.1 (CGIAR/CSI), are described and available accuracy assessments are briefly 124 summarised. The basic features and the URL web addresses of the three DEMs are given in Table 2.

#### 125 ASTER-GDEM2

126 The joint Japanese–US Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER) 127 (Abrams et al. 2002) Global Digital Elevation Model (GDEM) version 2 was released in October 2011 128 (three years after its predecessor, version 1) by the Ministry of Economy, Trade and Industry (METI) of 129 Japan together with the United States National Aeronautics and Space Administration (NASA). Since 130 2000 the Japanese ASTER instrument, payload on NASA's Terra satellite, acquires stereo image data 131 with its two nadir- and backward-viewing telescopes, which are sensitive in the near infrared spectral 132 band. The Sensor Information Laboratory Corporation (SILC) has developed an automatic processing 133 methodology for the generation of the GDEM from ASTER's along-track stereoscopic sensors 134 measurements. The Terra spacecraft's near-polar orbit covers the Earth's land surfaces between  $\pm$  83 135 degrees latitude and the nominal ground sampling distance is 15 m. The GDEM heights refer to the 136 WGS84/EGM96 geoid and are provided as 1 x 1 degree tiles in GeoTIFF format with geographic 137 latitude/longitude coordinates sampled to a one arc-second (approximately 30 m) grid. In total 22,600 138 tiles, each of 24.7 MB size (accounting for almost 560 GB in total) can be downloaded free of charge, 139 e.g. at the Earth Remote Sensing Data Analysis Center (ERSDAC) of Japan. The basic features of ASTER 140 GDEM2 are listed in Table 2 (c.f. Tachikawa et al. 2011a).

141 In a summarising study by the joint Japan–US ASTER Science Team (Tachikawa et al. 2011b) comprising 142 a total of four independent validation studies, the vertical accuracy of ASTER GDEM2 is estimated to be around 17 m at a confidence interval of 95%. The major drawback of ASTER is that it is an optical 143 144 sensor and thus constant cloud cover over certain areas may lead to data voids ("holes") or artefacts 145 in the GDEM. Further, it is important to remember that ASTER maps the surface of the Earth including 146 all buildings and plant canopy, so heights do not reflect the bare ground where the ground is covered. 147 When validated against different height data sets, ASTER generally showed higher offsets in the 148 canopy, exceeding even SRTM elevations in forested areas, and negative offsets were observed over low- or non-vegetated areas. Compared to version 1, the updates in the algorithm to generate version 149 150 2 lead to a finer horizontal resolution, a correct detection of water bodies as small as 1 km<sup>2</sup>, and the

<sup>119</sup> Table 2: Basic features of the three global digital elevation models ASTER GDEM2, SRTM3 USGS v2.1 and SRTM CGIAR-CSI 120

- 151 global adjustment of an elevation offset of –5 m (Tachikawa *et al.* 2011a). Furthermore, two additional
- 152 years of observation are incorporated in GDEM2, reducing the data voids and artefacts in areas of
- 153 sparse observations.

154 ASTER GDEM products have already been subject to evaluations and to comparisons with ground-truth 155 data. ASTER GDEM1 (version 1) has been evaluated in several studies and we refer to the list of 156 IDEMS (http://www.cse.dmu.ac.uk/EAPRS/iag publications given at the homepage 157 /relevant\_publications.html) for further information. The findings of the four studies of the joint 158 Japan–US ASTER validation team dealing with the quality assessment of ASTER GDEM2 (Krieger et al. 159 2010; Carabajal 2011; Gesh et al. 2011; Tachikawa et al. 2011a) shall not be repeated here, but relevant 160 results are discussed and compared to our computations.

161 SRTM1-3

162 SRTM digital elevation data sets are the joint effort of NASA, NGA and the German Aerospace Center

163 (DLR) and the Italian Space Agency (ASI). The SRTM elevations are based on interferometric evaluations

164 of observations of the dual radar antennas (sensitive for C- and X-band) on board of the *Shuttle Radar* 

- 165 *Topography Mission's* spacecraft, which flew in February 2000 (Farr *et al.* 2007). All landmass between
- 166 56 degrees south and 60 degrees north (that is around 80% of the Earth's total landmass) are covered
- 167 by SRTM observations and are contained in SRTM DEMs.

168 Since 2000, a number of SRTM DEMs have been created and made available for the public, initially by 169 the USGS, with different ground sampling (SRTM1: 1 arc-second/30 m; SRTM3: 3 arc-seconds/90 m; 170 SRTM30: 30 arc-seconds/900 m) and spatial coverage. The highest resolution data set (SRTM1) 171 available over US territory. Since the release of the initial SRTM data sets, which are also referred to 172 as "research grade", improved "finished-grade" models have become available. Currently, the latest 173 version number for the finished grade release is v2.1. Version 2.0 improved over the first unedited 174 release, as water bodies and coastlines have been incorporated accurately and single pixel errors have 175 been removed in the latter. However, the second version contained occasional artefacts, stripes 176 beyond 50 degrees latitude and no-data areas. The latest SRTM3 version is based on an averaging 177 method (each 3 x 3 pixels) that leads to an elimination of most high-frequency artefacts (USGS 2009). 178 The no-data areas are still present in the latest version, which is a major drawback of the data set, as 179 it is up to the user to fill the data 'holes'. The centre column of Table 2 lists the basic features of the 180 SRTM3 v2.1 release.

181 The SRTM DEMs generally suffer from different kinds of errors, which can only be removed to some 182 extent a posteriori. First of all, SRTM does not always map the bare ground surface. The measurement 183 is influenced by buildings, vegetation and snow cover (especially the northern hemisphere), as radar 184 waves only partially penetrate the vegetation canopy, snow, ice and very dry soil (Farr et al. 2007). 185 Additionally, in case of extremely smooth areas or water surfaces, sometimes no radar signal returned 186 to the antenna and respective areas were given the void value. In Rodriguez et al. (2005), those and 187 other typical SRTM error sources such as radar shadows and foreshortening, which appear at steep 188 slopes, are explained in more detail and absolute error estimates are given for various continents 189 based on comparisons to independent ground control points. It is found, that SRTM meets and often 190 exceeds the official performance criteria (16 m) as absolute vertical errors are below 9 m (90% 191 confidence).

192 SRTM V4.1 (CGIAR-CSI)

193 The latest SRTM release (version 4.1) by the *Consortium for Spatial Information* (CSI) of the 194 *Consultative Group for International Agricultural Research* (CGIAR) is a further processed version of the

195 original (finished grade/version 2) NASA/USGS SRTM (Farr *et al.* 2007) 1-degree tiles at 3 arc-seconds

196 (90 m) ground resolution (Table 2). The post-processed CGIAR-CSI SRTM release provides seamless and

197 complete elevation surfaces for the globe (between 56°S and 60°N). They are complete due to a SRTM 198 tailored void-filling interpolation method described in Reuter et al. (2007) and due to auxiliary data 199 sets, used to fill-in even large data 'holes' that were present in the USGS releases (Rodriguez et al. 200 2005). Over Australia 255,471 no-data pixels, corresponding to approximately 0.03% of the Australian 201 landmass, could be filled making use of Geoscience Australia's GEODATA TOPO 100 k data in CGIAR-202 CSI's SRTM release (Hirt et al. 2010). With their processing efforts CGIAR-CSI aims to enable SRTM data 203 to be used for a wide range of applications, such as hydrological and gravity modelling, without the 204 necessity of (void-treating) pre-processing steps.

- 205 The CGIAR-CSI SRTM v4.1 DEM has been evaluated over Australian territory in Hirt et al. (2010) and 206 compared with ASTER GDEM1, Australia's national elevation data set GEODATA DEM-9s (ver3) and 207 ground-truth data sets (comprising 911 GPS/levelling and 6392 levelling ground control points (GCPs)). 208 The SRTM v4.1 data set was found to be a serious alternative to the GEODATA DEM-9s (which among 209 others has been used to fill SRTM holes in mountainous areas) and shows RMS (root-mean-square) 210 values around 6 m when compared to the GCPs. However, due to the location of the GCPs, the RMS is 211 only representative for rather less-vegetated areas. Systematic biases (too large SRTM heights) are 212 generally to be expected in densely vegetated areas (as shown e.g. in Germany (Denker 2004) and
- 213 Switzerland (Marti 2004)).

## 214 Australian National Gravity Database

The Australian National Gravity Database (ANGD), compiled by Geoscience Australia, comprises the 215 216 data of a multitude of national gravity surveys conducted all over the Australian continent from as 217 early as 1938. The records of over 1700 surveys provide information on the Earth's gravity acceleration 218 at more than 1.6 million stations in Australia (Wynne & Bacchin 2009). Importantly, the ANGD provides 219 - with varying accuracy - 3D-positions (latitude, longitude and heights above mean sea level) of the 220 gravity stations. As such, parts of the 3D-positions available through the ANGD represent a valuable 221 source of information on the topography, which are exploited here as ground-truth comparison data 222 for the evaluation of digital elevation models.

The ANGD inherent heterogeneity in terms of data quality mainly results from the technical and methodological progress of surveying engineering since 1938. The single surveys were conducted by individuals, governmental institutions and private companies, using different quality requirements. The accuracy of the gravity measurements and 3-D station information were improving in the course of time. *Geoscience Australia* has put considerable effort in providing metadata on the single surveys in the ANGD by creating an *Index of Gravity Surveys* (Wynne & Bacchin 2009). ANGD is to be used with some care, as already five different geodetic datums find application in the database.

In terms of station distribution, the entire Australian continent is well covered by the ANGD. However,
 the station spacing varies from 11 km in remote areas (parts of Western Australia and Northern
 Territory) to 1.5 km in urban areas (c.f. Wynne & Bacchin 2009).

233 In Table 3 we categorise all ANGD stations according to six different positioning confidence levels 234 (based on the metadata in the Index of Gravity Surveys) ranging from poor (level 1) to ultra-high 235 accuracy (level 6). Stations assigned, e.g. to level 6 are also assigned to the respective lower levels, as 236 they also fulfil the accuracy requirements of those levels. Out of the 1.6 million ANGD stations roughly 237 1 million stations' positions are known with 5 m vertical and 50 m horizontal uncertainty (or better) or 238 with 1 m vertical and 100 m horizontal uncertainty (or better), respectively. Of these, 229,174 stations 239 show a positioning accuracy in the order of 10 cm (or better) due to the use of GPS for positioning in 240 the latest gravity surveys. As such, a large number of highly accurate GCPs are available for the DEM 241 evaluation. The station distribution and regional differences in accuracy (e.g. stations with high, very 242 high and ultra-high positioning accuracy or confidence levels 3 to 6) highlight the heterogeneity of the 243 positioning data of ANGD stations (Figure 1). Note that orthometric heights

### 244 Table 3: Number of ANGD stations with 3-D positions complying different positioning accuracy levels (cumulative).

Positioning confidence	Positioning confidence level	Elevation (Vertical) accuracy [m]	Location (Horizontal) accuracy [m]	Number of ANGD stations
Poor	1	20	1000	1,624,954
Medium	2	5	100	1,403,052
High	3	5	50	959,663
High	4	1	100	956,155
Very High	5	1	10	775,437
Ultra High	6	0.1	0.1	229,174

245

(heights relative to the geoid) as well as ellipsoidal heights (heights relative to the WGS84 ellipsoid)
are provided for each station. In this study, only the ellipsoidal heights that were transformed to
orthometric heights by consistently subtracting the geoid heights obtained from EGM96, are used.

#### 249 **DEM EVALUATION**

#### 250 Vertical (elevation) accuracy assessment methods

The vertical (elevation) accuracy assessment yields quality estimates for the (orthometric) heights that are given by all individual digital elevation models relative to the geodetic datum WGS84/EGM96.

253 In a first step, the models are intercompared grid-wise by calculating elevation differences for the 254 entire Australian continent. These differences help to identify large-scale systematic errors (such as 255 offsets) and small-scale anomalies (such as voids) in the individual models. In the comparison of ASTER 256 GDEM2 with the two SRTM DEMs, the ASTER grid is down-sampled to the coarser SRTM grid-spacing 257 (3 arc-seconds) by arithmetically averaging  $3 \times 3$  ASTER pixel arrays. This method is similar to the 258 production of the finished grade SRTM3 USGS release (which also is the basis for the CGIAR-CSI release) 259 itself (c.f. USGS 2009), and ensures that both datasets become spectrally consistent. Therefore down-260 sampling ASTER seems the most adequate method to deal with the different DEM resolutions. 261 Consistent land-water masking using the SRTM Water Body Data ensures that water-values do not 262 distort the comparison. Further, only areas where both data sets have valid topographic information 263 were taken into account (data-voids were masked out).

In a second step, the models are compared to GCPs from the ANGD at the two highest confidence levels. The models' heights at the ANGD stations' locations are retrieved by means of a bicubic interpolation. In order to be consistent with the orthometric DEM heights  $H_{DEM}^{ortho}$  the respective geoid heights  $N_{EGM96}$  taken from the EGM96 (*Earth Gravitational Model 1996*; Lemoine *et al.* 1998) are subtracted from the ellipsoidal ANGD heights  $H_{ANGD}^{ellip}$ . Expressed by formula, the difference Δh is obtained in the following way:

270 
$$\Delta h = H_{DEM}^{ortho} - (H_{ANGD}^{ellip} - N_{EGM96})$$

271 Those differences are used subsequently to determine statistical values, such as mean, standard 272 deviation, median, minimum, maximum and root-mean-square differences. Further, these statistics 273 evaluated as well as a function of the land cover and terrain type present at the ANGD stations' 274 locations, allows a more precise interpretation of the DEM's performance. In the case of land cover 275 analyses, we use ESA's open access GlobCover 2009 map (Bontemps et al. 2011), based on ENVISAT-276 MERIS observations (Defourny et al. 2009), with 300 m ground resolution. The originally provided 23 277 land cover types are reduced down to three categories that approximately represent bare ground 278 areas (~ 46%), shrub- and grassland (~ 36%) and forest areas (~ 10%) (see Figure 2). GlobCover types 279 that did not overlap with ANGD stations are classified as "unused / non-classified" (~ 8%). Table 4

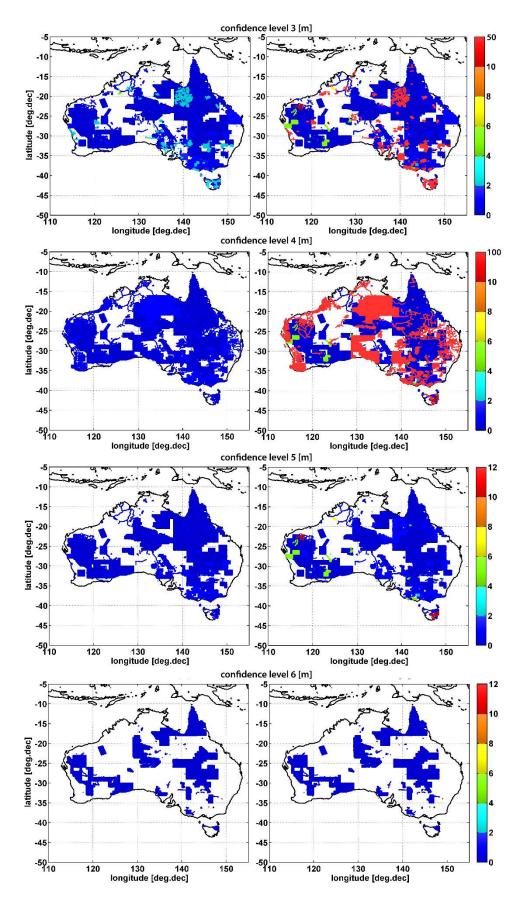
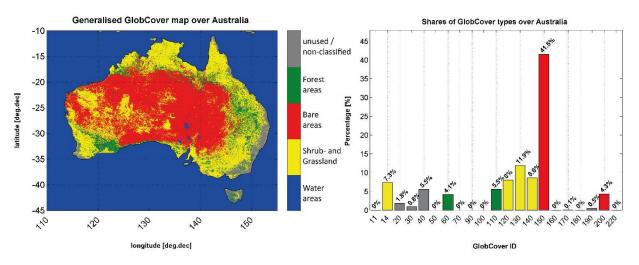




Figure 1 : Distribution and station location accuracy of the ANGD stations within the four highest positioning confidence
 levels in metres (confidence level 3 [upper row] to 6 [bottom row]); vertical (elevation) accuracy [left column] and horizontal



285

284

Figure 2: Spatial distribution of the three land cover types 'forest areas', 'shrub- and grassland' and 'bare areas' over 286 Australia [left plot] and the shares of the individual GlobCover land cover types in the Australian landmass in percent by 287 GlobCover ID [right plot].

288 shows the detailed assignment of the GlobCover land-types (with ID and label) to the three groups. In

289 the case of terrain analyses, we categorise each ANGD station by the RMS of the heights (later referred

290 to as *terrain RMS*) in a 1 x 1 degree sized tile in which the station is located. The parameter terrain type

291 then relates directly to the height amplitudes of the topographic relief in the station's vicinity.

292 The vertical accuracy is correlated to and deteriorated by shortcomings in horizontal positioning 293 (georeferencing accuracy) in the DEMs as well as in the GCPs. Consequently, the DEMs are corrected for the calculated horizontal offsets in the following analyses of the vertical accuracy. 294

#### 295 Vertical accuracy assessment results

296 The results of the intercomparison of the three DEMs over the entire Australian continent reveal 297 interesting differences among the models. Figure 3 (b-d) shows the RMS of 0.25 x 0.25 degree sized 298 tiles (each comprising 360 000 points). The comparisons indicate that the ASTER GDEM2 data set has 299 northeast- to southwest-aligned stripes with RMS amplitudes at the 10 m level (maximum up to 25 m). 300 Independent vidence that the stripes are a problem in the ASTER data was given by comparisons to 301 ANGD stations (not shown). The SRTM data sets show very good agreement (RMS < 1 m) except for a 302 1 degree-wide east-west (E-W) oriented stripe, centred at -29.5° latitude. The good agreement 303 between both SRTM releases reflects the dependence of the two data sets, as CGIAR-CSI is based upon 304 the finished grade USGS SRTM3. Close-up comparisons to USGS SRTM3 and ASTER GDEM2 (not shown 305 here) reveal a geolocation offset of 1 pixel in north-south (N-S) direction of the SRTM CGIAR-CSI 306 release between -30.01° and -29° latitude. The error generally is of minor amplitude (< 10 m) 307 compared to the error inherent to ASTER GDEM2, and therefore the differences in Figure 3c do not 308 display the stripe but the artefact is partially visible in the comparison of ASTER GDEM2 and SRTM 309 CGIAR-CSI around 152° longitude and –29.5° latitude.

310 Apart from the stripes, there is no notable systematic error visible and no obvious correlation with topography in comparisons between ASTER and SRTM (compare Figure 3a, c or d). Only in the area of 311 312 the highest elevations in the Australian Alps (around 147.5° longitude and –36.5° latitude) the RMS is 313 larger. A more detailed visualisation of a region in the Australian Alps covering 726 m<sup>2</sup> (Figure 4) reveals 314 the no-data values in the USGS data set (accounting for 273 pixels in dark red), which predominately

315 appear in steep valleys or along the southeastern slope of mountains.

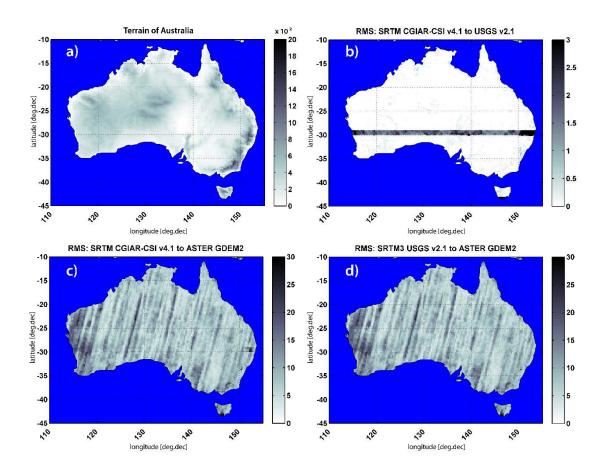
Land cover group	GlobCover Label	GlobCover ID		
Bare areas	Sparse (<15%) vegetation			
	Bare areas	200		
Shrubland	Post-flooding or irrigated croplands (or aquatic)			
	Rainfed croplands	14		
	Mosaic grassland (50-70%) / forest or shrubland (20-50%)	120		
	Closed to open (>15%) (broadleaved or needle-leaved, evergreen or deciduous) shrubland (<5m)	130		
	Closed to open (>15%) herbaceous vegetation (grassland, savannas or lichens/mosses)	140		
Forest areas	Closed (>40%) broadleaved deciduous forest (>5m)	50		
	Open (15-40%) broadleaved deciduous forest/woodland (>5m)	60		
	Closed (>40%) needleleaved evergreen forest (>5m)	70		
	Open (15-40%) needleleaved deciduous or evergreen forest (>5m)	90		
	Mosaic forest or shrubland (50-70%) / grassland (20-50%)	110		
Unsed / non-	Mosaic cropland (50-70%) / vegetation (grassland,shrubland,forest) (20-50 %)	20		
classified	Mosaic egetation (grassland,shrubland,forest) (50-70 %) / cropland (20-50 %)	30		
	Closed to open (>15%) broadleaved evergreen/ semi-deciduous forest (>5m)	40		
	Closed to open (>15%) mixed broad- and needleleaved forest (>5m)	100		
	Closed to open (>15%) broadleaved forest regularly flooded	160		
	Closed (>40%) broadleaved forest or shrubland permanently flooded or waterlogged soil	170		
	Closed to open (>15%) grassland or woody vegetation on regularly flooded or waterlogged soil	180		
	Artificial surfaces and associated areas (Urban areas > 50%)	190		
	Permanent snow and ice	220		
	No data (burnt areas, clouds, )	230		

316 Table 4: Composition of the land cover groups 'Bare areas', 'Shrubland' and 'Forest areas' with GlobCover land cover types.

317

Table 5 summarises the intercomparison of the DEMs. ASTER GDEM2 shows a negative bias of -5 m (= mean difference: ASTER minusSRTM) and a RMS deviation of almost 9.5 m relative to SRTM over Australia. The negative bias means that ASTER are "below" SRTM heights. Similar comparisons with ASTER GDEM1 made by Hirt *et al.* (2010) indicate an improvement of GDEM2 over GDEM1 of about 2 m RMS compared with the SRTM data. The comparison of both SRTM data sets reveals a very good fit with no elevation bias and an RMS of 1.2 m, which is likely to reflect the differences of the postprocessing in the CGIAR-CSI v4.1 and the USGS SRTM3 v2.1 release (and the stripe).

Note that within the intercomparison of the DEMs, water areas and voids of the involved data sets have been masked out. Consequently, in the statistics (Table 5) CGIAR-CSI shows a misleadingly worse performance than USGS SRTM3 (in comparisons to ASTER GDEM2), because in the latter DEM the problematic regions (voids) are neglected whereas in the first DEM the holes were filled (Reuter *et al.* 2007). Additionally, the stripe resulting from the georeferencing offset found in CGIAR-CSI also accounts for some increase of the RMS.



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Figure 3: Comparison of DEMs over Australia: (a) Terrain of Australia, (b) SRTM CGIAR-CSI - SRTM3 USGS, (c) SRTM CGIAR CSI - ASTER GDEM2, (d) SRTM3 USGS - ASTER GDEM2; Units are in metres.

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The comparison of the DEMs with ANGD GCPs as a function of the land cover is summarised statistically in Table 6 for positioning confidence level 5 (dH  $\leq$  10 m, dXY  $\leq$  1 m) and level 6 (dH  $\leq$  0.1 m, dXY  $\leq$  0.1 m). When comparing the total RMS generated with level 5 and level 6 GCPs, a significant deterioration of the statistics, due to the less accurate positioning of the level 5 GCPs, becomes visible. Conversely, lower standard deviations reflect the higher confidence of level 6 GCPs. In consequence only the statistics with level 6 GCPs are discussed in the following, although in a relative sense the level 5 GCPs allow similar findings.

Table 5: Statistical results of the DEM intercomparison over Australia; no-data areas were excluded for the comparisons
 including the SRTM USGS data set.

Comparison	Min [m]	Max [m]	Mean [m]	RMS [m]
ASTER GDEM2 vs. CGIAR-CSI SRTM	-583.0	4288.0	-5.0	9.36
ASTER GDEM2 vs. USGS SRTM3	-553.6	3920.3	-5.0	9.21
CGIAR-CSI SRTM vs. USGS SRTM3	-201.0	359.0	0	1.21

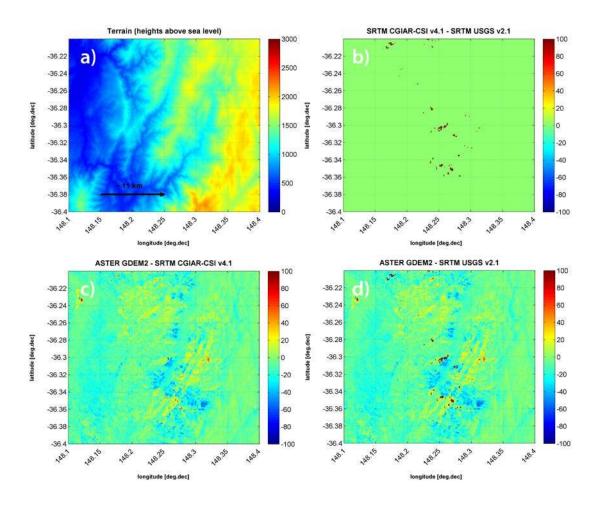
344

From the total RMS of 4.4 m and the total standard deviation of 3.2 m, the CGIAR-CSI v4.1 SRTM release

346 shows the best fit to all ANGD stations of confidence level 6. It is followed by the USGS SRTM3 v2.1

release with 6.2 m RMS. ASTER GDEM2 shows the largest discrepancies to the ANGD GCPs (RMS of 8.5

348 m). Similarly, the histograms (Figure 5) reveal the superior accuracy of both SRTM DEMs compared to ASTER GDEM2. However, compared to ASTER GDEM1, which showed an RMS of 13.1 m to 15.7 m over 349 350 Australia against GPS/levelling and levelling GCPs, respectively (Hirt et al. 2010), we observed an RMS 351 of 8.5 m for GDEM2 that means an RMS improvement of about 4 m to 7 m of the successor model. 352 Note that that some of the detected improvement is likely to be due to higher quality ground truth 353 data and/or a different distribution of GCPs in our study compared to Hirt et al. (2010), as also CGIAR-354 CSI SRTM v4.1 shows lower RMS in the order of 1 m to 2 m in our research. The height biases of the 355 individual DEMs (discussed in the following) always refer to the mean of the differences obtained with 356 the ANGD stations heights. While the ASTER data seems to systematically underestimate heights, as 357 shown by the total mean (bias) of -3.8 m, the SRTM data sets show a positive mean bias of around 3 358 m and thus rather overestimate the true topographic height. In the case of SRTM, the bias can be 359 explained with SRTM measuring the top of canopy.



360

Figure 4: Close-up comparison of DEMs over a region in the Australian Alps: (a) Terrain, (b) SRTM CGIAR-CSI - SRTM3 USGS,
 (c) ASTER GDEM2 - SRTM CGIAR-CSI, (d) ASTER GDEM2 - SRTM3 USGS; no-data values (voids) are shown in dark red; Units are in metres.

Classifying the ANGD stations by land cover and calculating the statistics within each class, the bias is seen to be highest for ANGD stations located in forest areas (around 3.6 m) but over bare ground areas we still see a positive bias of around +2.7 m. In the case of ASTER, the observed negative bias can be explained by the DEM calibration (an offset of -5 m has been adjusted in GDEM2; Tachikawa *et al.* 2011b) aiming for a best average fit to the Earth's topography. Given ASTER is also sensitive to the top of canopy, the best fit is "distorted" and the calibration consequently has lead to a negative ('true') bias over bare areas. The offset of -4.2 m for ASTER GDEM2 over bare ground is higher than the already

# observed 'true' negative elevation bias of 1 m (Tachikawa *et al.* 2011b). Compared to the investigations in Hirt *et al.* (2010) over Australia, where ASTER GDEM1 reported a mean negative bias

Table 6: Statistical analyses of the height differences to ANGD stations of ASTER GDEM2, SRTM CIGAR-CSI v4.1 and SRTM3
USGS v2.1 for the two highest ANGD positioning confidence levels for different land cover groups (in metres);GCPs located
in SRTM3 void cells are excluded from all statistics.

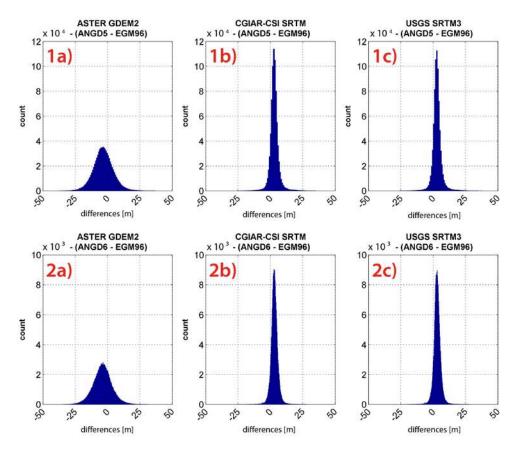
ANGD Confidence Level	DEM	Land Cover group	Number of Stations	Minimum [m]	Maximum [m]	Median [m]	Mean [m]	STD [m]	RMS [m]
5	ASTER GDEM2	Bare Areas	330366	-97.78	103.78	-3.81	-3.64	6.94	7.84
		Shrubland	307103	-164.74	624.66	-3.61	-3.74	9.39	10.10
		Forest Areas	70440	-165.08	167.99	-2.39	-2.31	8.55	8.85
		Total	773330	-165.08	624.65	-3.42	-3.23	8.64	9.22
	SRTM	Bare Areas	330039	-53.65	129.93	2.66	2.64	2.27	3.48
	CGIAR-CSI v4.1	Shrubland	306877	-157.93	639.16	2.93	2.94	5.37	6.12
		Forest Areas	70392	-165.03	178.67	3.57	3.67	4.90	6.12
		Total	772696	-165.03	639.16	2.86	3.05	4.75	5.65
	SRTM USGS	Bare Areas	330039	-546.50	129.93	2.66	2.59	4.51	5.20
	v2.1	Shrubland	306877	-553.11	639.16	2.93	2.92	5.68	6.39
		Forest Areas	70392	-165.03	178.67	3.56	3.67	4.89	6.11
		Total	772696	-553.11	639.16	2.85	3.02	5.52	6.29
6	ASTER	Bare Areas	122553	-62.25	53.92	-4.19	-4.22	6.86	8.05
	GDEM2	Shrubland	77086	-85.06	110.53	-3.57	-3.69	8.27	9.05
		Forest Areas	19427	-52.11	60.98	-3.32	-3.51	7.24	8.05
		Total	229045	-85.06	110.53	-3.82	-3.80	7.63	8.52
	SRTM	Bare Areas	122509	-38.37	24.15	2.72	2.69	2.13	3.43
	CGIAR-CSI v4.1	Shrubland	77082	-157.93	41.76	3.35	3.18	3.70	4.88
		Forest Areas	19425	-45.66 42.86 3.79	3.79	3.64	3.72	5.20	
	Tot	Total	228994	-157.93	47.76	2.99	3.04	3.22	4.43
	SRTM USGS	Bare Areas	122509	-546.50	58.51	2.72	2.62	5.65	6.22
	v2.1	Shrubland	77082	-553.11	41.76	3.35	3.15	5.09	5.98
		Forest Areas	19425	-45.66	42.86	3.79	3.63	3.72	5.19
		Total	228994	-553.11	58.51	2.96	2.99	5.40	6.17

376

of -8 m (from GPS/levelling GCPs) up to -9 m (from levelling GPCs), we can confirm the adjustment of
 an elevation bias of approximately -5 m in the second ASTER release. Overall, GDEM2 has improved
 significantly compared with its predecessor.

380 The evaluation of the three DEMs with ANGD GCPs of confidence level 5 as a function of terrain type 381 (terrain RMS) is summarised in Table 7. The parameter terrain RMS is defined above and is used here to categorise the ANGD GCPs into five groups of different terrain roughness. Unlike the land cover 382 analyses, the analyses of the dependence of the DEM accuracy on terrain type is performed only with 383 384 ANGD stations of confidence level 5, because ANGD stations of level 6 are hardly available in 385 mountainous terrain. At the first glance, the RMS values in Table 7 indicate that the accuracy of the DEMs depends on the roughness of the terrain; the rougher (= steeper) the terrain, the higher the RMS 386 387 compared with ANGD GCPs and vice versa. However, this outcome must be balanced against the fact 388 that level 6 GCPs (which are comprised in the level 5 GCPs) are predominately found in smoother 389 terrain. In other words, the portion of GCPs of lower accuracy is higher in the terrain categories 390 mountainous and very mountainous. Nevertheless, it becomes clear that ASTER GDEM2 outperforms

both SRTM releases in very mountainous terrain, as both SRTM DEMs show an RMS of 15 m as opposed
to the 11.3 m RMS of ASTER GDEM2. This behaviour indicates that the 3 arc-seconds SRTM resolution
is not good enough to accurately represent the terrain shape in steep terrain. The higher RMS of SRTM
DEMs may also be related to known SRTM problems, such as radar-shadows or foreshortening in the
presence of steep slopes (Rodriguez *et al.* 2005). In the other terrain categories (apart from very
mountainous terrain) CGIAR-CSI SRTM v4.1 shows the best fit to ANGDGCPs, followed by SRTM USGS
v2.1.



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Figure 5: Histogram showing the distribution of the height differences to ANGD stations of ASTER GDEM2 (a), SRTM CIGAR CSI v4.1 (b), and SRTM3 USGS v2.1 (c) for the two highest ANGD positioning confidence levels (in metres); plots 1a–1c:
 confidence level 5; plots 2a-2c: confidence level 6.

#### 402 Horizontal (georeferencing) accuracy assessment methods and results

In the following, the methods and the results of the determination of possible georeferencing offsets
 between the different DEMs are described. Knowledge of georeferencing offsets is of great importance
 as the horizontal location errors deteriorate correct height information.

406 For the determination of the georeferencing offset with subpixel resolution (1/1000 of a pixel) we 407 make use of the cross-correlation procedure by Guizar-Sicairos et al. (2008), which efficiently 408 computes the offset between two 2D images by means of a matrix-multiply Digital Fourier 409 Transformation (DFT). Again, data sets of different resolution are made compatible in terms of 410 resolution and spectral content by down-sampling ASTER to the coarser SRTM grid. Note that tests showed that by up-sampling SRTM to the ASTER resolution the calculated horizontal offsets of single 411 412 tiles deviate in the sub-pixel range. However, in our analyses we focus on the down-sampling 413 approach, as in the up-sampling approach both data sets are not spectrally consistent.

414 Comparing both SRTM releases no horizontal offset could be discovered, apart from a 1 degree E–W

aligned stripe centred at  $-29.5^{\circ}$  latitude. As found above, within this stripe the respective CGIAR-CSI

SRTM tiles show a 1 pixel shift relative to the rest of the tiles (and relative to the SRTM3 USGS release).

As a consequence, the USGS SRTM release was used to determine the relative georeferencing offset between ASTER GDEM2 and SRTM. Our analysis in 529 samples (each comprising 1.44 million points) of 1 x 1 degree sized tiles spread over the Australian continent (between  $-35^{\circ}$  < latitude <  $-15^{\circ}$  and 115° < longitude < 150°) reveal an average relative N–S offset of -0.007 arc-seconds and -0.100 arc-

421 seconds offset in E–W direction (Figure 6, left plot). The standard

DEM	Terrain Type	Number of Stations	Terrain RMS [m]	Min [m]	Max [m]	Median [m]	Mean [m]	STD [m]	RMS [m]
ASTER	Very smooth	268527	< 200	-72.16	404.41	-2.75	-2.40	7.70	8.07
GDEM2	Smooth	265899	200 - 400	-156.01	502.90	-3.92	-3.91	8.37	9.24
	Rough	154955	400 - 600	-129.63	112.56	-3.96	-3.58	8.72	9.43
	Mountainous	78205	600 - 800	-165.08	624.66	-3.07	-3.26	11.43	11.89
	Very Mountainous	5744	> 800	-40.16	85.35	-1.88	-0.38	11.29	11.30
SRTM	Very smooth	268270	< 200	-62.81	409.43	2.51	2.68	3.23	4.19
CGIAR-CSI v4.1	Smooth	265622	200 - 400	-129.53	510.09	3.13	3.16	4.36	5.39
	Rough	154862	400 - 600	-75.50	91.74	3.12	3.49	4.64	5.81
	Mountainous	78198	600 - 800	-165.03	639.16	2.63	2.76	8.06	8.52
	Very Mountainous	5744	> 800	-38.76	73.53	5.27	7.50	13.07	15.0
SRTM USGS	Very smooth	268270	< 200	-195.65	409.43	2.51	2.67	3.34	4.28
v2.1	Smooth	265622	200 - 400	-394.37	510.09	3.13	3.13	5.19	6.06
	Rough	154862	400 - 600	-402.53	91.74	3.12	3.45	5.82	6.76
	Mountainous	78198	600 - 800	-553.11	639.16	2.63	2.72	9.41	9.79
	Very Mountainous	5744	> 800	-38.76	73.53	5.27	7.49	13.07	15.0

422 Table 7 : Statistical analyses of the height differences to ANGD stations of ASTER GDEM2, SRTM CIGAR-CSI v4.1 and SRTM3
423 USGS v2.1 for the ANGD positioning confidence level 5 for different terrain types (in metres).

424

425 deviation of the offsets is 0.61 arc-seconds in N–S direction and 0.74 arc-seconds in E–W direction. 426 The standard deviations are rather large and may to a large part be the result of systematic striping 427 errors in the ASTER GDEM2 heights (and to errors in USGS SRTM3 heights), deteriorating the cross-428 correlation procedure. Between adjacent 1 x 1 degree tiles there can be up to 20 % difference 429 regarding the determined offset of each tile. Performing the offset determination applying the same 430 procedure to 138 tiles of 2 x 2 degree size (each comprising 5.76 million points) over the same territory, 431 the georeferencing offset of ASTER GDEM2 in N–S and E–W direction is –0.042 arc-seconds and –0.136 432 arc-seconds, respectively (Figure 6, right plot). The standard deviations are slightly smaller using the

433 bigger tiles (0.52 arc-seconds in N–S and 0.53 arc-seconds in E–W direction).

Compared to other studies, our georeferencing offset of ASTER GDEM2 compared with SRTM appears quite low in N–S direction, but the determined offset in E–W direction can be confirmed (c.f. Tachikawa *et al.* 2011b: 0.104 arc-seconds E–W and –0.175 arc-seconds N–S shift determined globally by NGA; –0.130 arc-seconds E–W and –0.190 arc-seconds N–S shift determined over Japan). The discrepancies between our study and others might be explained with our focus on Australian territory whereas such analyses so far were performed over Japan (Tachikawa *et al.* 2011a) or with a global scope (Krieger *et al.* 2010).

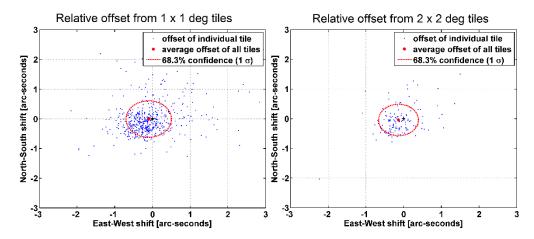


Figure 6: Scatter plot showing the distribution of the offsets between ASTER GDEM2 and SRTM3 USGS determined in 529
1x1 degree tiles [left plot] and determined in 138 2x2 degree tiles [right plot] with the individual tile offsets (blue), their

444 mean value (red) and corresponding confidence ellipses (red dashed line).

#### 445 SUMMARY AND OUTLOOK

441

446 Three of the most up-to-date and freely-available global digital elevation models have been 447 intercompared and evaluated externally by accurate ground truth information over Australian 448 territory. The intercomparison reveals a systematic northeast- to southwest-aligned striping error in 449 ASTER GDEM2, which was already present in the first GDEM release, with RMS amplitudes at the 10 m 450 level (RMS maximum up to 25 m). Further, ASTER GDEM2 shows a mean height offset of –5 m and a 451 RMS deviation of almost 9.5 m compared with both SRTM models. Our investigations indicate an 452 improvement of the second ASTER version (GDEM2) over the first version (GDEM1), as similar investigations in a study by Hirt et al. (2010) showed an RMS of 11.7 m and a height offset of -7.7 m 453 454 of ASTER GDEM1 compared with SRTM CGIAR-CSI v4.1. The SRTM DEMs as released by CGIAR-CSI 455 (v4.1) and USGS (v2.1) generally show a very good fit (RMS=1.2 m) over Australia which is not surprising 456 given the dependency of both models on the same space mission. Close-up comparisons reveal that 457 data voids (holes) that exist in SRTM3 USGS v2.1 (predominately in mountainous terrain) are filled in 458 SRTM CGIAR-CSI v4.1. Further, the comparison reveals a higher RMS in an E–W aligned stripe of 1° 459 width centred at  $-29.5^{\circ}$  latitude, which results from a georeferencing shift in the respective tiles of 460 SRTM CGIAR-CSI v4.1 (by one pixel). ASTER GDEM2 is found to be shifted by -0.007 / -0.042 arcseconds in N–S direction and –0.100 / –0.136 arc-seconds in E–W direction relative to both SRTM 461 DEMs. The values largely confirm the results in previous studies (Krieger et al. 2010; Tachikawa et al. 462 463 2011a), however, the applied image co-registration algorithm by Guizar-Sicairos et al. (2008) shows 464 high standard deviations (~ 0.6 arc-seconds) which could be caused by the systematic striping error in ASTER GDEM2. 465

466 The external evaluation is based on a large and (in view of DEM-evaluations) unexploited ground truth 467 data set consisting of observed heights (levelling and GPS/levelling) at stations of the Australian National Gravity Database. In total 775,437 stations out of 1,624,954 ANGD stations are found be of 468 sufficient positioning accuracy (dH  $\leq$  10 m, dXY  $\leq$  1 m) to evaluate digital elevation models. Analysing 469 470 the height differences between the DEMs and the ANGD GCPs as a function of three land cover groups 471 (generalised from ESA's GlobCover 2009 map; Bontemps et al. 2011), we provide evidence that the heights of all DEMs reflect the surface of the Earth (including vegetation and buildings) rather than the 472 473 actual topography. The mean height differences are higher in areas with constant vegetation/tree 474 cover than in areas, which are barely vegetated (where bare ground can be sensed from space). Our 475 estimate for the true height offset (over bare ground) is -4.2 m for ASTER GDEM2 and +2.7 m for both 476 SRTM DEMs. The analyses of the height differences to ANGD GCPs compared with the terrain type 477 present at the ANGD station reveal a high correlation between terrain roughness and DEM accuracy. 478 The rougher the terrain, the higher the RMS to ANGD GCPs becomes and vice versa. Importantly, over

- very mountainous terrain ASTER GDEM2 shows a better fit to ANGD stations (RMS=11.3 m) than SRTM
   CGIAR-CSI v4.1 or SRTM3 USGS (RMS = 15.1 m), which might be linked to the higher spatial resolution
- 481 of ASTER GDEM2. Over all other (less rough) terrain types, however, SRTM CGIAR-CSI shows superior
- 482 fit compared with the GCPs.

Taking into account only the 229,147 most accurate ANGD stations, CGIAR-CSI SRTM v4.1 clearly shows the best vertical accuracy (RMS=4.4 m) followed by USGS SRTM3 v2.1 (RMS=6.2 m) and ASTER GDEM2 (RMS=8.5 m). On the one hand, ASTERGDEM2 is still not comparable to the SRTM DEMs in terms of vertical accuracy. On the other hand, ASTER GDEM2 has improved significantly compared with its predecessor as the comparisons of ASTER GDEM1 with levelling and GPS/levelling heights by Hirt *et al.* (2010) revealed a RMS of 13.1 m and 15.7 m, respectively.

- 489 This study demonstrated that the latest freely-available digital elevation models relying on the data of 490 the Shuttle Radar and Topography Mission are mostly superior to the stereoscopic ASTER GDEM2 over 491 Australia. Nevertheless, ASTER GDEM2 can be regarded as a fairly good data base over areas that are 492 not covered by SRTM (between +60°N and +83°N and between +56°S and +83°S) and where SRTM 493 shows shortcomings and voids, e.g. in very mountainous regions. The (truly) global digital elevation 494 model WorldDEM (http://www.astrium-geo.com/worlddem/), which will become available in ~ 2015, 495 will probably set a new milestone in terms of highly-accurate information on Earth's topography 496 (predicted vertical accuracy: 2 m relative / 10 m absolute). It will be generated from data of TanDEM-497 X (Moreira et al. 2004; Bartusch et al. 2008), another space-borne radar mission. First validation results 498 show that with a block adjustment approach and ground control points as ties even an absolute vertical 499 accuracy of 1–2 m seems possible (Gruber et al. 2012). Unfortunately, WorldDEM will not be free-of-500 charge at resolutions better than 90 m, thus SRTM based DEMs will continue to be of great importance.
- 501

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