1 Long Wavelength Sinuosity of Linear Dunes on Earth and Titan and the Effect of

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2 Underlying Topography

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22 Key Points:

- Local variations in dune trend are identified in some linear dunefields on Earth and Titan.
- The cause is identified as underlying topographic relief resulting in down-slope deflection of dunes.
- Dunefield patterning offers the potential to infer topographic relief, with implications for identifying planetary lander sites.
- 28

29 Abstract

On both Earth and Titan, some linear dunefields are characterized by curvilinear patterning 30 atypical of the regularity and straightness of typical longitudinal dunefields. We use remotely 31 sensed imagery and an automated dune crestline detection algorithm to analyze the controls on 32 spatial patterning. Here it is shown that topography can influence the patterning, as dune 33 34 alignments bend to deflect downslope under the influence of gravity. The effect is pronounced in a terrestrial dunefield (the Great Sandy Desert, Australia) where substantial topography 35 underlies, but absent where the dunefield is underlain by subdued relief (southwestern Kalahari). 36 This knowledge allows the inference of subtle topographic changes underlying dunefields from 37 dunefield patterning, where other sources of elevation data may be absent. This methodology is 38 explored using the Belet Sand Sea of Titan, and likely areas of topographic change at resolutions 39 finer than those currently available from radar altimetry are inferred. 40

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42 Plain Language Summary

43 Linear dunes form large dunefields both on Earth and Saturn's moon Titan, and look remarkably similar on both worlds. They are characterized by repeated ridges of sand which extend 44 approximately parallel to the wind, and may continue unbroken for tens or even hundreds of 45 kilometers. Perhaps their most remarkable feature is their regularity, and consistent orientation of 46 the dunes. In a few locations, however, the dunes form distinctive curved patterns. This study 47 investigates the causes of this phenomenon, by comparing two dunefields on Earth; Australia's 48 49 Great Sandy Desert, where the curved dunes are abundant, and the Kalahari of southern Africa, where they are absent. 50

The cause of the curved dunes is shown to be underlying topography. The Kalahari is very flat, and thus the dunes form straight lines. But the Great Sandy Desert lies over a long-dry river valley system, and where the dunes encounter slopes, the deflect downslope. On Titan, knowledge of surface elevations and topography is patchy, and with lander missions planned better understanding is important. The method of analysis proposed here is demonstrated on radar data from the Belet dunefield of Titan, and we show that topography can be inferred from dune patterning alone.

58

59 **1 Introduction**

Accurate determination of surface topography is crucial for the success of planetary landers (e.g. 60 Braun & Manning, 2007; Golombek et al., 1997; Striepe et al., 2006; Witte et al., 2016). 61 Although final guidance is typically done autonomously (e.g. using LiDAR; Johnson et al., 62 2002), initial site selection remains crucial if hazard avoidance is to be maximized. This is often 63 hampered by a lack of high-resolution imaging and/or topographic data of a world's surface, 64 perhaps best illustrated by the design of the Huygens lander for Saturn's moon Titan as part of 65 the Cassini-Huygens mission, given that at the time of launch it was unclear whether the landing 66 would be on a solid or liquid surface (Zarnecki et al., 2005). The fact that the surface was 67 revealed during the descent of the lander not only to be solid, but topographically complex 68 (Soderblom et al., 2007), makes the successful landing even more remarkable. The continued 69 Cassini Prime, Equinox, Solstice and Grand Finale missions (2005-2017) included a total of 127 70 Titan close flybys, and yet the most robust published elevation model for Titan (Corlies et al., 71 72 2017), based on radar altimetry, radar SAR and photogrammetry, is still based on just 9.2% coverage, with the rest interpolated. Both for reasons of understanding geological processes 73 (Corlies et al., 2017), but also in the light of future exploration of Titan (Lorenz et al., 2017; 74 Turtle et al., 2018), better understanding of Titan's topography is needed. 75

Linear dunes (that is, dunes forming approximately longitudinal to the net sand-moving winds; 76 77 Fryberger & Dean, 1979; Lancaster, 1982; Tsoar, 1983) are the most abundant desert dune type on Earth (Lancaster 1989; Lancaster, 1995). They also form the most extensive dune system in 78 79 the solar system as an equator-encircling belt on Titan covering as much as 15% of the body (Lorenz & Radebaugh, 2009; Lorenz et al., 2006; Radebaugh et al., 2008; Radebaugh et al., 80 2010). Whether linear dunes align with the net annual sand transporting wind (McKee, 1979), to 81 maximize the net annual sand transport across the crest of the dune (Rubin & Hunter, 1987), or if 82 there is a supply-limited control on their orientation (du Pont et al., 2014; Ping et al., 2014) is 83 debated. Their remarkable regularity and consistency in terms of orientation, relief and spacing 84 across distances of 1-10³ km distinguish them; "Earth has no landform more regular and 85 extensive" (Cooke et al., 1993; p.374). Typically, this regularity is expressed in landforms which, 86 on Earth, are 5 - 120 m high, extend for 10 - 100 km, are regularly spaced on the order of 500 - 100 km high spaced on the order of 500 - 100 km 87 5000 m, and which typically occur in groupings of up to 1000 with orientations deviating by 88 only a few degrees over the course of 100s of km (Fig. 1a, 1b; Lancaster, 1995). On Titan, an 89 estimated 2×10^5 km³ of organic material is distributed in the equatorial belt of linear dunes, 90 typically approaching ~100 m high where measurements are possible, and similarly arranged in 91 regular, repeated patterns of hundreds of adjacent dunes (Lorenz et al., 2008; Lorenz & 92 Radebaugh, 2009; Lorenz et al., 2006; Radebaugh et al., 2008; Rodriguez et al., 2014). 93

Although linear dunes are characterized by their regularity and organization relative to the 94 regional wind regime, their orientation and planform patterning can also be influenced by 95 obstacles within the dunefield. On both Earth (Fig 1c) and Titan (Fig 1d) dunes are seen to 96 reorient themselves upwind of topographic obstacles. This topographic steering is well-reported 97 for terrestrial coastal dunes (e.g. Bauer et al., 2012; Walker et al., 2009), and the mechanism 98 relates to feedbacks with the deformable bed and boundary layer which propagate upwind 99 (Wilson, 1972), by which bedforms may be deflected even kilometres upwind of the obstruction 100 to sediment transport. 101

In some dunefields, however, a singular, preferential orientation of the dunes is less pronounced; 102 103 the dunes' orientation over a given region, whilst spacing remains regular, is more complex. This effect is seen in areas of the Great Sandy Desert of northwestern Australia (Fig. 1e), as well as 104 105 the Australian Great Victoria Desert (Hesse, 2010; 2011) and is also observed on some of Titan's dunefields (Fig. 1f). In both of these cases, the dunes have a pronounced, large-scale curvilinear 106 patterning in planform, resulting in long-wavelength (~10-100 km) sinuosity of the dunes 107 without obvious topographical obstructions causing the deflections in patterning (Lucas et al., 108 2015), as well as the continental-scale (100-1000 km) curvature shown by some dunefields 109 relating to synoptic-scale changes in typical wind regime (e.g. Hesse, 2010; Lancaster, 1981). 110 There is, however, pronounced variability in the topography underlying the Great Sandy Desert, 111 and it is this topographical influence that we seek to investigate. This paper thus aims to 1) 112 investigate the causes of broad-scale linear dune curvilinearity in the terrestrial setting, and 2) 113 explore the analogue inferences that can thus be derived for Titan's dunefields. We do this by 114 investigating 1) the Great Sandy Desert of western Australia, where locally curvilinear 115 duneforms are found, 2) the southwestern Kalahari, where a regional shift in linear dune 116 orientation exists but localized variability is absent and 3) the Belet Sand Sea on Titan, where 117 localized shifts in dune orientation are apparent. This enables us to deduce the topographic 118 influences on different terrestrial dunefields and to explore the likely inferences for planetary 119 topography that can be interpreted from dunefield patterning. 120

121 **2 Materials and Methods**

We use the Aster GDEM (NASA/METI, 2001), and Landsat8 RGB (Red:Green:Blue – Bands 4-122 2) and panchromatic data (Band 8), to analyse a) a region of the Great Sandy Desert in 123 northwestern Australia, between 19 - 21°S and 122 - 125°E, b) the southwestern Kalahari of 124 125 southern Africa, between 24 - 27°S and 19-21 °E. All analysis was performed within ArcGIS 10.3. The Linear Dune Oriented (LIDO) algorithm presented by Telfer et al. (2015) was used on 126 the 15 m resolution panchromatic Band 8 data to define dune crestlines based on changes in 127 image brightness apparent at the crests of the dunes. A pan-sharpened RGB composite was used 128 for validation of the automated classification of crestlines. Full methodological details of the 129 algorithm, its accuracy and precision, and details of the images used are provided in Telfer et al. 130 (2015) and in the Supplementary Material, but in summary, the routine uses a pair of 5x5 Sobel 131 operators on the panchromatic image to derive gradient magnitude and direction. These are used 132 to identify reflectance gradients within $\pm 45^{\circ}$ of the modal direction (which correspond to dune 133 crest orientation), and the reflectance gradient magnitude is then used to define candidate 134 crestline pixels. In this instance, the recursivity of defining strong and weak candidate dune 135 crest-line zones proposed in Telfer et al. (2015) was not found necessary, and pixels were 136 included where the gradient magnitude exceeded μ + (1.25 × σ) (where μ is the mean reflectance, 137 and σ the standard deviation). Resultant zones of less than 4500 m² were excluded to reduce 138 noise, and candidate pixels were then vectorized using ArcGIS's ArcScan tool (see 139 Supplementary Material for details of the settings employed). Only vectorized crestline sections 140 141 in excess of 1 km length were considered for further analysis to further reduce noise. ArcGIS's Linear Directional Mean tool was used to derive a regional average orientation for the dunes, and 142 the variation of individual dunes from this mean was subsequently classified using the Natural 143 Breaks method with Jenks optimization within ArcGIS. 144

For the Belet dunefield of Titan, we use a mosaic of the equatorial, trailing hemisphere T8 and 145 T61 Cassini Synthetic Aperture RADAR (SAR) swaths. These offered a pixel size of 146 approximately 180×180 m. The study area extends from latitudes -5.6° to -10.2° - -12.3° and 147 longitudes 108.7° to 124.3°; a total area of approximately 180,000 km². The dunes on Titan are 148 characterized by a change in their 2.17 cm SAR reflectance relative to the surrounding terrain, 149 with dunes being SAR-dark and underlying materials, and sometimes crestline reflections, being 150 SAR-bright, similar to 3-cm SAR observations of fine dune sand on Earth. This, together with 151 152 presence in some areas of apparently sandy interdunes and relatively poor image resolutions, means that rather than observing the change in visible light at the crestline (i.e. the contrast 153 154 between illuminated and shadowed flanks of the dunes), we note that we are likely to be mapping the dune/interdune margin (e.g. Savage et al. 2014). Nonetheless, examples of the 155 resultant digitization (see Supplementary Material) suggest that the routine accurately captures 156 157 overall trends at the scales investigated here. The LIDO algorithm was again used to define dune trendlines, although the different characteristics of the SAR observations necessitated some 158 modification of the protocol. Due to the noisier nature of the Cassini SAR data compared to the 159 Landsat images, a 3×3 low-pass filter was applied initially to reduce the influence of unduly 160 SAR-bright pixels. This was then passed with the same pair of Sobel operators, from which 161 gradient magnitude and direction were calculated. Despite clear visual differentiation of many of 162 the dunes, the strength of the gradient was highly variable on a pixel-by-pixel basis, and a 163 relaxed criterion of μ - (0.25 \times σ) sigma was required. Combined with a slightly widened 164 criterion for inclusion in terms of gradient direction (\pm 60° of the mode), suitable delineation of 165 dune sections was achieved. Once again, relatively small candidate zones were removed (< 1.6 166

167 km²) and trendlines vectorized with ArcScan. Reflecting the lower resolution of the SAR data, 168 only sections longer than 3 km were included for further analysis.

169 **3 Results**

170 *3.1 Great Sandy Desert*

The LIDO algorithm identified a total of 44 823 crestline sections in excess of 1 km in length 171 172 (mean = 2.14 km, standard deviation = 1.36 km, maximum = 39.70 km) for the studied sector of the Great Sandy Desert. This region epitomizes the long-wavelength, sinuous linear dunes, and is 173 topographically characterized by a broad E-W drainage in its northern half (the Mandora 174 175 palaeodrainage (Tapley, 1988; Wyrwoll et al., 1986); the catchment is currently dry), with ~230 m relief, and highlands (~250 m elevation) in the south (Fig. 2a). The dunes propagate 176 essentially westwards under the influence of easterly net sand-transporting winds associated with 177 the continental anticyclone (Hesse, 2010; Kalma et al., 1988). Linear dunes (Fig. 2b) are widely 178 distributed across the region, and do not show clear regional trends in abundance, though there 179 are, as is common in linear dunefields, some localized groupings of dunes, especially in the 180 southern part of the study area. However, when the deviation of individual dune orientation is 181 calculated against the regional mean (roughly E - W: 281.4°; Fig. 2c), a relationship with the 182 topography (Fig. 2a) becomes apparent. When the deflection from Fig. 2c is averaged to a 5km 183 grid (Fig. 3a), the zonal nature of the local reorientation of the dunes can be clearly seen, and is, 184 in, part, related to landscape roughness, in this case the standard deviation of elevations from 185 Fig. 2a over a 5 km grid (Fig. 3b). However, it is when the slope orientation, derived from the 186 regional elevation data from Fig. 2a and gridded to 5 km squares, shown as arrows in Fig. 3c, is 187 188 shown against the 5 km gridded dune deflection (3a) that the true nature of the relationship becomes apparent (Fig. 3c). Dunes deflect northwards (red colors) when the slope descends 189 towards the north, and southwards (blue) in the case of south-dipping slopes. Given the westward 190 propagation of the dunefield, dunes deflect downslope when obliquely encountering both rising 191 and falling topography. 192

193 3.2 Southwestern Kalahari

The studied sector of the southwestern Kalahari dunefield occupies a broad swathe of dunes 194 trending approximately NNW-SSE, and the LIDO algorithm identified 30 782 crestline sections 195 in excess of 1 km in length. The topography of the region is very subdued (Fig. 4a) and has 196 indeed led to the coining of the term 'geomonotony' (Eckhardt, 2010); dunes are on the order of 197 8-10 m in elevation, and the few dry valleys that dissect the dunes are typically broad (~10 km) 198 and shallow (~30 m). Deviations to the mean regional trend of the dune crestlines are limited to a 199 shift from north-south trending at the northern end of the study area to northwest-southeast 200 trending at the southern edge of the dunefield (Fig. 4b and 4c). This overall pattern is well-201 reported, and typically associated with the southern African continental anticyclone (Lancaster, 202 1980; Lancaster, 1981; Lancaster, 1988). Although some very localized reorganisation of pattern 203 and orientation in the vicinity of dry valleys is apparent along the Auob and Nossop river valleys 204 205 (Fig. 4a; Bullard & Nash, 1998, 2000), in general, the zonal variability evident in the Great Sandy is absent here. Similarly, no clear relationship exists between the deflection of the dunes 206 (Fig. 5a) and the minimal landscape roughness (Fig 5.b), or the low-relief slopes evident 207 throughout the dunefield (Fig. 5c). Only in a small region adjoining the Nossob catchment in the 208

far north of the study region does enhanced topography coincide with local deflection of the dunes at the scale investigated here.

211 4 Discussion

The findings presented in the preceding section can be summarized; where substantial 212 topographic variation exists beneath a linear dunefield, it can result in downslope deflection of 213 the dunes and disruption of the regional pattern. This effect is quantified in Figure 6. For the 214 Great Sandy Desert, with its substantial (~200 m) local variation in topography, there is a strong 215 correlation between the incidence angle between the dunes and the underlying slope, and the 216 resultant deviation from the regional mean trend of the dunes (Fig. 6a). This correlation is further 217 increased (Fig. 6b) when the incident angle of the dune trend/slope angle is weighted by the 218 magnitude of the slope; that is, steeper local slopes seem to deflect dunes more than shallow 219 gradients. The magnitude of the deflection of the dune is maximized when the dune/slope 220 intercept reaches 90° (that is, when the dune trend is orthogonal to the local slope). By contrast, 221 for the Kalahari, with its low relief underlying the dunefield, no such correlation is apparent, 222 223 either unweighted (Fig. 6c) or weighted (Fig. 6d). Although the effect is seen here manifested around a large valley system, the presence of deflection even on dunes extending up slopes 224 implies that similar effects are likely on positive relief. 225

A number of possibilities exist for the mechanism controlling this effect. Because, by definition 226 of their topographic expression, aeolian entrainment and deposition on dune surfaces is rarely on 227 horizontal, flat surfaces, the influence of slope on aeolian processes has been studied using 228 numerical modelling (e.g. Tsoar et al., 1996; White & Tsoar, 1998), computational fluid 229 230 dynamics (Fariaet al., 2011; Huang et al., 2008) and wind tunnel experimentation (Bullard & Nash, 1998; Bullard et al., 2000; Iversen & Rasmussen, 1994, 1999; White & Tsoar, 1998). Few 231 studies have focussed at the landform scale, and fewer still consider the role of oblique slopes. 232 However, wind tunnel experimentation has suggested that the net result of oblique winds 233 incident to a valley is the deflection of the wind along the valley (i.e. in the opposite direction to 234 that observed here for downward slopes) (Bullard and Nash, 2000; Garvey et al., 2005). This 235 suggests that a mechanism other than simple topographic steering of winds along valleys is 236 necessary to explain the observations. 237

Two possibilities are suggested here for a mechanism by which the dunes are deflected 238 downslope. Firstly, it may simply be a gravitational effect, as whether dunes are descending or 239 ascending incident oblique slopes, the deflection is downhill. Whilst gravity-driven (that is, 240 katabatic) winds are known to be influenced by topography (e.g. Nylen et al., 2004), it is also 241 possible that gravitational effects would also presumably affect individual transported grains by 242 preferential settling on deposition from aeolian transport downslope; on deposition, grains might 243 roll downhill, but will not roll uphill. Extrapolated to the landform scale, the result would be the 244 deflection of the dune crestline down the slope. Alternatively, it may be that the effect of the 245 246 valley on the localized wind regime acts in a manner analogous to that known to occur over positive topographic features, such as coastal foredunes. Here, the effect of topography in 247 steering incident winds towards the normal direction of the crestline is well described (reviewed 248 in Hesp et al., 2015), and results from the pressure gradient force resulting from differential flow 249 acceleration associated with oblique incident winds. Whilst the impacts of such topographic 250 steering have predominantly been studied on dunes transverse to the net air flow, it is possible 251

that pressure-driven force associated with flow separation could deflect the linear dunes. Such 252 253 effects have been modelled using wind tunnels and differing geometries of valley (Bullard et al., 2000), and whilst it was generally observed that the effect of negative topography was the 254 255 steering of streamlines along the valley line (i.e. the opposite direction to that observed here), it is also noted that the effects are a function of a complex set of variables including valley 256 geometry, thermal stability of the airmass and wind regime. Further study is needed to 257 disentangle the relative roles of gravity-driven mechanisms and possible localized effects of 258 259 topography on the wind regime in realigning the dunes.

These results suggest a method for identifying topography from dunefield patterning where no 260 such elevation data might otherwise be sparse, or missing, at the relevant scale. Here we apply 261 the dune trendline detection method to the Belet dunefield on Titan, where similar curvilinear 262 dune patterning to that observed in the Great Sandy Desert is present. The studied region consists 263 of a broad belt of west-east trending dunes (sand transport direction inferred to be eastward from 264 dune interactions with obstacles; Radebaugh et al. 2010) with several radar-bright obstacles 265 interrupting the patterning, and a dark, largely dune-free corridor to the southeast of the images. 266 The LIDO algorithm identifies 5322 dune sections of at least 3 km length within the studied 267 region, with a radial mean orientation of 79°. 268

When the deviation in the dune orientations from the regional mean is considered (Figure 7a), 269 the superficial similarity with the Great Sandy Desert is further supported. Unlike in the 270 Kalahari, variation in dune orientation occurs at a relatively local scale. In some instances 271 272 (Figure 7b), such as in the far northwest of the studied area, these deviations are clearly adjacent to radar-bright gaps in the dune sands, and this effect is both well-reported (Ewing et al., 2015; 273 Lorenz et al., 2006; Radebaugh et al., 2008; Radebaugh et al., 2010; Savage et al., 2014), and 274 likely to be due to deflection of dunes around obstacles (i.e. mountains or hills) standing proud of 275 the dunefield. But in other areas, localized variance in dune trendline is not obviously associated 276 with obstacles, and thus we propose that this is likely the result of underlying topography at a 277 scale not observed by Cassini SAR and radar altimetry data. The resultant likely topographic 278 trends are illustrated in Figure 7b, and are likely to be at a scale more subtle than that observable 279 from the Titan Digital Elevation Model (DEM) (Corlies et al., 2017). While some lineations in 280 the southern and eastern part of the image can still be observed but not selected by the LIDO 281 algorithm, it is tempting to suggest that at least a portion of that corridor is, in the light of its 282 morphology and the inferred slopes down into this region, a fluvial or relic fluvial valley (Birch 283 et al., 2016; Burr et al., 2013; Jaumann et al., 2008; Langhans et al., 2012; Lorenz et al., 2008). 284 It is also possible that small-scale (i.e. individual dune) deflections evident in some parts of the 285 studied area are indicative of localized dune trends, but further work is needed to confirm this. 286 Such information may prove valuable in planning lander sites for future missions to Titan, as it 287 offers additional information regarding the surface of potential landing sites and their surface 288 topography. In addition to the likely increase in surface roughness associated with fluvial erosion 289 creating local topographic relief, it is also likely that Titan's fluvial channels, especially those 290 that are radar-bright, may have increased frequency of fluvially-derived clasts (Burr et al., 2013), 291 an additional hazard for planetary landers. 292

It has been noted that despite the differences of Titan's different atmospheric density (146 KPa, or 145% that of Earth), gravity (1.35 m s⁻², or 14% that of Earth) and likely particle density (0.4-1.5 g cm⁻³, or 15-55% that of Earth's silicate sands), the similarity of the resultant aeolian landforms to terrestrial dunes is striking (Lorenz et al., 2006). The presence of curvilinear
longitudinal dune forms is further evidence of this similarity. It is possible that their presence on
Titan, given the low gravity and very low particle/fluid density ratio (Burr et al., 2015), might
favour pressure-gradient mechanisms.

300 **5** Conclusions

We investigate the properties of linear (longitudinal) dunefields where the typically highly-301 consistent orientation of dunes is less pronounced, and curvilinear, long-wavelength sinuosity is 302 apparent. Such patterning is scarce on Earth, but relatively common on Titan. We show that on 303 Earth, such patterning results from underlying topography causing the dunes to deflect 304 downslope as they form and propagate. The effect is maximized as the incidence angle between 305 the dunes and the slope approaches 90°, and is further shown to be dependent on the gradient of 306 the slope, with steeper slopes resulting in more pronounced deflection. Dune morphometry thus 307 308 offers an additional source of information regarding local and regional topography where such information is scarce, as is the case for some planetary dunefields. The mechanism by which the 309 dunes are deflected likely relates to either gravity-driven processes affecting either the airflow or 310 311 settling grains, or by local pressure gradients related to airflow separation; the presence of the curving dunes even in Titan's low gravity may favour the latter. We demonstrate the potential of 312 this method to infer topography in a region of the Belet Sand Sea in Titan's equatorial belt, and 313 suggest it offers the potential to increase topographic understanding of the surface of Titan both 314 for geological purposes and in terms of identifying optimal lander sites for future missions. To 315 find the lowest relief areas amongst the dunes, future landers would be best guided away from 316 areas where dunes demonstrate long-wavelength sinuosity. 317

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489

494 **Figure 1**. Linear dunes are typified by remarkably regular planform patterning, with dunes

- aligned approximately parallel to the net sand-transporting regional winds. Examples from a) the
- 496 Simpson Desert, Australia and b) the southwestern Kalahari of central southern Africa highlight
- this regularity. In the case of the Kalahari, the orientation patterns demonstrate the occasional
 tendency of these dunefields to reflect changes in the orientation of regional-scale atmospheric
- 498 tendency of these dunenelds to reflect changes in the orientation of regional-scale atmospheric 499 circulation patterns. Such dunes may reorient around topographic obstacles to sand-transporting
- wind flow, illustrated here from c) the Libyan Sahara (23.75°N, 21.38°E) and d) the Belet
- dunefield of Titan (from the T61 swath, Aug. 2009). Figure 1a, 1b, 1c and 1e are courtesy of
- 502 Google Earth/SPOT/CNRS. In some regions, however, the dunes take a curvilinear form without
- obvious topographic obstructions causing the change to patterning, seen here in e) the Great
- 504 Sandy Desert of northwestern Australia and f) the Belet dunefield (from T8, October 2005).

Figure 2. Topographic data and dune alignment for the Great Sandy Desert. a) The relief of the Great Sandy Desert, b) Dune crestlines as determined by the LIDO automated detection routine, and c) the deflection of the dune orientations relative to the regional mean (red = northwards; blue = southwards), which highlights the localized nature of the pattern deviation. Net sand transport is east-west.

- 510 **Figure 3.** The influence of relief on the orientation of sand dunes in the Great Sandy Desert. a)
- shows the deviation in the regional directional trend from 2c shown here as 5 km-gridded means;
- b) landscape roughness (here calculated as the standard deviation of elevations within a 5 km
- grid) can be seen to closely resemble the pattern of dune deflection; c) the relative orientation of
- the slope (arrows point downslope and are scaled by gradient) correlates most closely with the $\frac{1}{2}$
- 515 deflection of the dunes (see Fig. 6).
- **Figure 4.** Topographic data and dune alignment for the Kalahari. a) The relief of the
- 517 southwestern Kalahari, whilst showing greater regional changes than the Great Sandy, has much
- 518 more subdued local expression of relief. b) The dunes occur in a broad swathe with net sand-
- transporting wind from the north-northwest and c) deviations in the dune crestline orientations,
- unlike the Great Sandy, do not show pronounced local variation (cf Figure 2c), but instead reflect
- 521 large-scale regional changes.
- 522 **Figure 5.** The influence of relief on the orientation of sand dunes in the Kalahari. a) The
- southwestern Kalahari's regional trend in dune orientation is largely independent of the relief,
- and b) the topographic roughness (again, shown as standard deviations of elevation around a 5
- km downsampled grid of the Aster GDEM v2.0 data) is much lower throughout the dunefield.
- 526 The higher relief mountains in the southwestern corner of the image are beyond the dunefield
- 527 limits. c) The magnitude and orientation of local slopes again highlights the lower relief apparent
- 528 here.
- 529 **Figure 6.** The relationship between the deflection of the dunes and the incident slope angle is
- dependent upon the degree of underlying topography. a) The deflection of the Great Sandy's
- dunes from the regional mean (approximately east-west; 280.4°) plotted as a function of the
- relative orientation of the 5 km gridded local slope, and b) the same data, but weighted according
- to the magnitude of the gradient. Here a cubic fit is used to reflect the likely maximum deflection
- as slope incidence approaches $+/-90^{\circ}$. By contrast, no trend is apparent for the low-relief
- southwestern Kalahari, with the data either c) unweighted or d) weighted.

- **Figure 7.** The orientations of dune section at the eastern end of the Belet dunefield, as
- determined reveals some dune deviations attributable to deflection around obstacles, but also
- some which are not apparently associated with this mechanism. a) The dune trends mapped as
- deviations from the regional mean with major radar-bright obstacles highlighted in white, and b)
- annotated inferences reveal deviations likely due to not just topographic obstacles to airflow
- (white arrows), but also those likely due to underlying topography. Here, the inferred
- topographic trend is illustrated with a black arrow pointed downslope. These reveal details of
- topography not apparent from either c) the Imaging Science Subsystem (ISS) imagery or d) the
- derived elevation model data product (here from Lorenz et al., 2013).

Figure 1.



Figure 2.





Figure 3.





Figure 4.



Figure 5.



Figure 6.





Figure 7.

