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1	A novel	topographic	parameterization	scheme	indicates	that
-						

- 2 martian gullies display the signature of liquid water
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- 8 Keywords: Mars; Martian Gullies; Planetary Geomorphology; Geomorphometry
- 9
- 10

11 Highlights:

- We present new terrain analyses from high-resolution DEMs of martian gullies
- We find that liquid water was involved in the formation of martian gullies
- Dry processes do not explain gullies topographic signatures
- 15 Process-level interpretation from 2D images can be unreliable
- Statistical analysis of 3D data provides a better way to determine process

17 Abstract

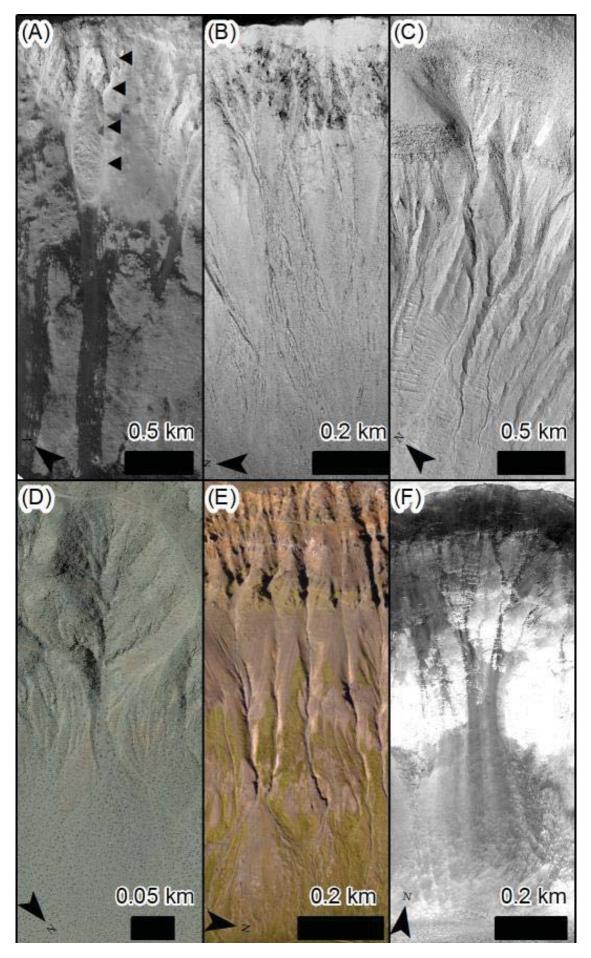
18 Martian gullies resemble gullies carved by water on Earth, yet are thought to have formed in 19 an extremely cold (<-50°C) and dry (humidity < 100 precipitable micrometers) surface 20 environment (c.f. Mellon et al., 2004). Despite more than a decade of observations, no 21 consensus has emerged as to whether liquid water is required to form martian gullies, with 22 some recent studies favoring dry CO₂-driven processes. That this argument persists 23 demonstrates the limitations of morphological interpretations made from 2D images, 24 especially when similar-looking landforms can form by very different processes. To 25 overcome this we have devised a parametrization scheme, based on statistical discriminant 26 analysis and hydrological terrain analysis of meter-scale digital topography data, which can 27 distinguish between dry and wet surface processes acting on a landscape. Applying this approach to new meter-scale topographic datasets of Earth, the Moon and Mars, we 28 29 demonstrate that martian gullied slopes are dissimilar to dry, gullied slopes on Earth and the 30 Moon, but are similar to both terrestrial debris flows and fluvial gullies. We conclude that 31 liquid water was integral to the process by which martian gullies formed. Finally, our work 32 shows that quantitative 3D analyses of landscape have great potential as a tool in planetary 33 science, enabling remote assessment of processes acting on planetary surfaces.

34 **1.0 Introduction**

35 Gullies on Mars (Malin and Edgett, 2000) are widespread: they are concentrated in the mid-36 latitudes and can be found on steep slopes polewards of about 30° (Dickson et al., 2007). 37 Global and hemispheric studies have revealed that mid-latitude gullies are located on slopes 38 oriented towards the pole (Balme et al., 2006; Bridges and Lackner, 2006; Dickson et al., 2007; Harrison et al., 2015; Heldmann et al., 2007; Heldmann and Mellon, 2004; Kneissl et 39 40 al., 2010; Marquez et al., 2005) while higher latitude examples have little, or no preferred 41 orientation. The distribution and orientation of gullies are consistent with their formation at 42 high obliquity, when pole-facing slopes receive maximum summer insolation. Together, this evidence led to the conclusion that gullies formed as water-rich debris flows (Costard et al., 43 44 2002).

45 However, increased insolation can also trigger dry mass wasting or destabilization of solid 46 CO₂. Narrow channels observed on the Moon (Bart, 2007; Senthil Kumar et al., 2013; Xiao et 47 al., 2013) and on the asteroid Vesta (Krohn et al., 2014; Scully et al., 2015) have been 48 identified as analogues to martian gullies by some authors, yet these exist on airless bodies 49 where erosion by traditional low-viscosity fluids is unlikely and whose surfaces are almost 50 certainly completely dry. Hence, dry mass-wasting has been considered a potential formation 51 mechanism for martian gullies. Some of the recent modifications observed in martian gullies, 52 including new deposits and channel formation, have been found to occur at the time of year 53 when CO₂ frost is subliming (Dundas et al., 2015, 2012, 2010; Raack et al., 2015; Vincendon, 54 2015). Therefore mechanisms involving gas release triggering granular flow (Cedillo-Flores 55 et al., 2011; Pilorget and Forget, 2016), have been suggested for gully-formation. Theoretical 56 modelling (Cedillo-Flores et al., 2011) predicts that sand-sized or smaller grains can be 57 mobilized by CO₂ gas-sublimation under martian conditions but, unless there is a confining "lid" (Pilorget and Forget, 2016) on the flow, it rapidly converts from a gas-supported to a 58

simple granular flow. Hence, we consider the visually-similar, gully-like granular flows
observed on the Moon as suitable analogues for this process. We also consider mass-wasting
deposits on Earth, in which water likely played a very minor role, as possible analogues for
this process.

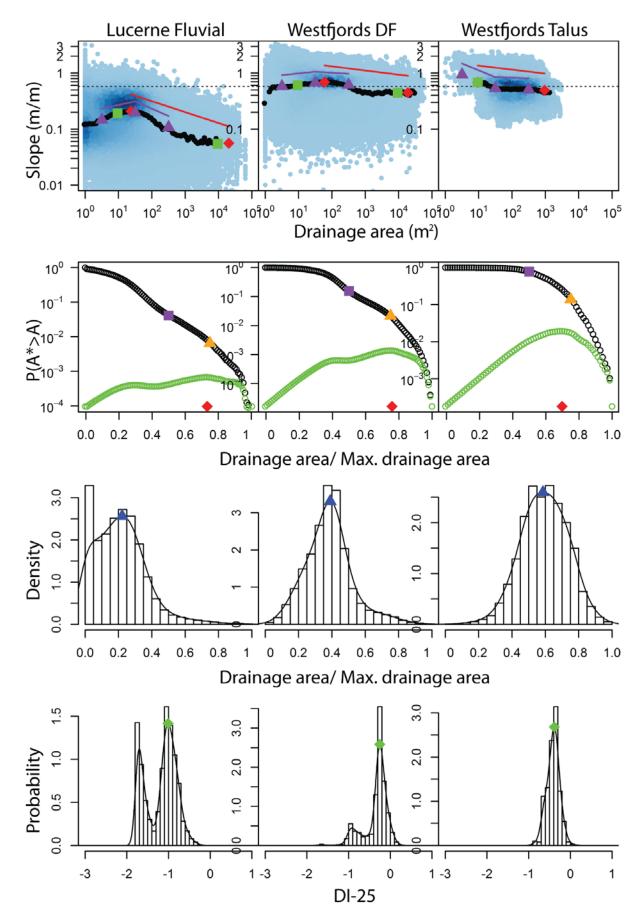


64 Figure 1. Images of gullies on different planets. (A) Gullies on the Moon (arrows indicate the position of the "channel"), LROC image M151169370. Credit: NASA/Goddard Space Flight 65 Center/Arizona State University. (B) Gullies on Mars in an unnamed crater NW of Lyot 66 67 crater, HiRISE image ESP 027231 2340. Credit: NASA/JPL/University of Arizona. (C) Gullies in Palikir Crater on Mars, HiRISE image PSP 005943 1380. Credit: 68 69 NASA/JPL/University of Arizona. (D) Ephemeral fluvial gully in Anderson Dry Lake, California on Earth – image from google Earth. (E) Gullies on the eastern flank of Tindastóll 70 71 Mountain, Iceland, Earth. Aerial image from NERC ARSF. (F) Talus slopes on the south-72 facing wall of Quebrada Camarones in the Atacama Desert northern Chile. Orthorectified 73 GeoEye image at 0.5 m/pix.

74

75 Here we go beyond plan-view comparisons of morphology, such as those illustrated 76 inFig. 1, by examining the three-dimensional properties of terrestrial, lunar and martian 77 gullies. The inspiration for this study came from the delimitation of process-domains from 78 digital elevation models of fluvial catchments on Earth. Montgomery and Foufoula-Georgiou 79 (1993) calculated upslope drainage area and local slope for elevation data-pixels within 80 fluvial catchments and showed that these properties follow a specific pattern in log-log space 81 that depends on which processes were active in the catchment. They included process 82 domains for fluvial and debris flow processes. We have further developed this approach by 83 including other terrain attributes that can discriminate between processes such as cumulative 84 area distribution, area distribution and 25 m downslope index, and by including dry granular 85 flows (rockfalls, ravel and dry mass wasting) as an end-member process. Such hydrological 86 analyses are not typically performed at the scale of the martian gullies (i.e. <5 km) because 87 the data were not historically available. In an earlier study (Conway et al., 2011a) though, we 88 showed that a qualitative comparison of slope-area and cumulative area distribution plots

- 89 could discriminate between terrains dominated by debris flow, rockfall and fluvial processes
- 90 on Earth at this scale. In the current study, we find that differences are also apparent in area
- 91 distribution, and 25m downslope index plots, as illustrated in Fig. 2. We extend our previous
- 92 work by analyzing additional sites, including the Moon, and, more importantly, by
- 93 performing a statistical analysis of the data.



96 Figure 2. Example terrain analysis plots for sites classed as fluvial, debris flow (DF) and talus on Earth from study sites in Lucerne Valley California and the Westfjords in Iceland 97 98 (see Supplementary Text and Table S2 for further details). to the first row are slope-area 99 plots, to the second cumulative area distribution plots, the third area distribution plots and the 100 fourth 25 m downslope index plots. The darker shades of the underlying points in the slope-101 area plots indicates a greater density of points. The dotted line in the slope-area plot is at 30° 102 slope – the approximate minimum dry angle of repose. Some of the parameters listed in 103 Table 1 are marked as follows: (1) in the slope-area plots (top row) the purple triangles are 104 (from left to right): avslp_1_10, avslp_10_100 and avslp_100_1000; the green squares are: 105 left, slp10 and right, slp10 4; the red diamonds are mxslp and mxslpA, located at the 106 maxima, and mxfacslp located at the furthest right; the red line represents gradMax_all 107 vertically displaced for clarity, and the purple lines represent (from left to right), grad100_10 108 and grad100_1000 vertically displaced for clarity. (2) In the cumulative area distribution plots (2nd row from top), the purple square represents CAD50pc, the yellow triangle 109 CAD75pc and the red diamond maxArCAD. The green points represent a rotated cumulative 110 111 area distribution plot, made in order to calculate maxDCad, maxArCAD and areaUCad. In 112 order to rotate the cumulative area distribution plot as illustrated, we calculated the straight 113 line that connected the first and the last point, and then subtracted the y-value of this line from every point in the plot. (3) In the area distribution plots $(3^{rd} row from top)$ the blue 114 triangle represents mxCadPkh and mxCadPkFac. (4) In the 25m downslope index plots 115 116 (bottom row) the green diamond represents maxDi25pkH and mxDi25pkFac.

117

118 **2.0 Development of Parameterization Scheme**

119 2.1 Hydrological analysis

120 The datasets used are fully described in the Supplementary Text, summarized in Tables S1 121 and S2. We followed the same approach as Conway et al. (2011a) in generating the terrain 122 attributes necessary for these analyses and a visual summary of these calculations is shown in 123 Figure S3. In brief, we used the multi-direction flow algorithm "dinf" which partitions flow 124 into downslope neighbors in any direction (Tarboton, 1997). From these non-integer flow 125 directions we calculated the (fractional) number of pixels located upstream of any given 126 pixel, from which we calculated the uphill drainage area (Fig. S3D). Local slope (Fig. S3C) 127 was calculated by taking the steepest of the eight triangular facets centered on the target pixel 128 (Tarboton, 1997). The wetness index maps (Fig. S3A) were calculated by taking the natural 129 logarithm of the ratio of drainage area to slope, excluding pixels with zero slope. We also 130 calculated the flow directions and local slopes using the classic "d8" algorithm whereby flow 131 is routed directly to a single downslope pixel, in one of the eight cardinal directions 132 (O'Callaghan and Mark, 1984). From the d8 flow directions we calculated the distance 133 downflow it is necessary to travel to achieve a given value of descent – the downslope index 134 (Hjerdt et al., 2004) (Fig. S3F). If the value of descent is fixed at or near the DEM resolution, 135 then the downslope index simply represents the steepest downstream slope. Conversely, if 136 values are chosen which are of the same vertical scale as the feature being studied (~500 m 137 for gullies), then within-feature detail is lost. We chose value of descent of 25 m, as a balance 138 between these two end-members. These manipulations were performed using the freely available software packages TauDEM tools (Tarboton, 1997; Tesfa et al., 2011) and 139 140 WhiteboxGAT (Lindsay, 2005).

141

142 **2.2 Generating hydrological plots and parameters**

143 The slope-area and cumulative area distribution plots were created following the method of 144 Conway et al. (2011a). Briefly, the slope-area comprises the local slope and drainage area for 145 every pixel plotted in log-log space, and these data are put into 0.05 wide log-drainage-area 146 bins and for each bin the slope is averaged. Bins with less than 100 points are excluded to 147 avoid bias of the mean by outlying datapoints, an approach employed commonly in other 148 studies (e.g., Grieve et al., 2016). For the cumulative area distribution, the same bins are 149 used, but the cumulative frequency for each bin is calculated. The non-cumulative area 150 distribution plot is simply the histogram of the values of the logarithm of the drainage areas 151 normalized by the maximum drainage area. The bin-width is 0.05. The curve is the kernel 152 density estimation of the same distribution with a bandwidth of 0.05. The 25m downslope 153 index plot is similarly the histogram of the logarithm of the 25m downslope index values 154 with a 0.1 bin-width and the line is the corresponding kernel density with a bandwidth of 155 0.075.

For the area distribution and 25m downslope index plots the number of peaks was calculated by counting the number of maximum inflections on the curve. The area under the tallest peak was calculated by integrating the curve between the minima on either side of the peak.

160

161 **2.3 Statistical analysis of terrain attributes**

In order to analyze a given hillslope, we outlined the feature of interest from the upper watershed boundary to the toe of the deposit-fan or lobes with the aid of hillshaded relief and wetness index maps. All the pixels from the slope, drainage area, and 25m downslope index grids that fell within these polygon outlines were extracted in order to create the slope-area, cumulative area distribution, area distribution and 25m downslope index plots. Instead of

167 subjectively comparing these plots (as in Conway et al., 2011a), we parameterized the slope-168 area, cumulative area distribution, area distribution and 25m downslope index plots, to allow 169 quantitative comparison. From visual inspection of the slope-area, cumulative area 170 distribution, area distribution and 25m downslope index plots of our terrestrial sites, and which are dominated by different processes, we noticed that they had qualitatively different 171 172 shapes and trends, as illustrated by typical "process type" examples in Fig. 2. This was an 173 observation we made in Conway et al. (2011a) and has already been discussed in detail in 174 previous publications for the slope-area and cumulative area distribution plots (e.g., 175 Brardinoni and Hassan, 2006; Lague and Davy, 2003; McNamara et al., 2006; Montgomery 176 and Foufoula-Georgiou, 1993; Perera and Willgoose, 1998). For example, Lague and Davy (2003) noted that a shallower slope at $<1 \text{ km}^2$ drainage area in the slope-area plot indicated 177 178 debris flow dominance in the system and McNamara et al. (2006) noted that concavity in the 179 cumulative area distribution plots indicates a transition from diffusive hillslopes to channel 180 incision.

181 We therefore extracted 28 parameters that we observed to vary with process from 182 inspection of the plots from our terrestrial sites, informed by trends noted in the literature. Some of these parameters are highlighted in Fig. 2. These include the slope of the trend in the 183 184 slope-area plot, the concavity of the cumulative area distribution plot, the skewness of the 185 area distribution and the number of peaks in the 25m downslope index plot; the full list of 186 parameters is given in Table 1. Not all these parameters have a clearly describable physical 187 meaning, they were chosen only because they appeared to discriminate between process. Using these 28 parameters, we performed canonical discriminant analysis 188 189 (McLachlan, 2004), a statistical technique which produces a linear combination of the 190 parameters which best separate pre-defined groups. This analysis allows assessment of

whether certain groups are separable, and identification of those parameters which are moreimportant in separating the groups.

193 We analyzed the topography of 104 sites (in 26 locations): 13 on the Moon, and 55 on 194 Earth, including 15 slopes presently dominated by fluvial processes, 27 by debris flow and 13 195 by dry processes, including rockfall, grainflow and ravel. Unfortunately, data of sufficient 196 resolution are not available to perform this kind of analysis for the proposed gully-like 197 features on Vesta (Scully et al., 2015). On Mars, we obtained data from 33 slopes with 198 gullies, and three without (in 'Zumba' Crater). We examined martian gully sites from a wide 199 spread of latitude (53°N to 68°S) and longitude (0-360°E) to sample a diverse group of 200 gullies. We did not include martian "gullies" formed in sand dunes slipfaces (e.g., Diniega et 201 al., 2013; Mangold et al., 2003; Pasquon et al., 2016; Reiss and Jaumann, 2003). For data-202 sources, resolutions and locations see Fig. S2, Tables S1-S2 and the Supplementary Text.

Parameter abbreviation	Plot	Description	Symbol Stand			ndardized canonical coefficients			Mean value per group			
abbreviation	from		011 F1g. 2	A1	A2	A3	B1	B2	fl	df	rf	mn
mxslp	S-A	the maximum value of slope along the moving average line	red diamond					2.79	0.452	0.882		0.891
mxslpA	S-A	the drainage area at which mxslp occurs	red diamond		-0.17	-0.35	0.31	0.32	15.954	11.392	6502.426	7.499
slp10	S-A	the value of the moving average line at a drainage area of 10 m ² , if there are fewer than 100 datapoints in this bin is expaned to $10^{1}\pm10^{0.2}$	_	-0.19	1.47	1.19	-0.39	-1.88	0.407	0.772	0.635	0.823
slp10_4		the value of the moving average line at a drainage area of 10^4 m^2 , if there are fewer than 100 datapoints in this bin is expaned to $10^4 \pm 10^{0.2}$	_	-0.24	-0.07	0.87	0.49	-0.65	0.196	0.453	0.480	0.510
avslp_1_10	S-A	The mean value of the slope in the range 1 to 10 m^2	purple triangle	0.42	0.88	2.02	-0.19	-2.09	0.378	0.753	0.625	0.794
avslp_10_100		The mean value of the slope in the range 10 to 100 m ²	purple triangle	0.67			-0.76		0.395	0.681	0.626	0.702
wslp_100_1000		The mean value of the slope in the range 100 to 1000 m^2	purple triangle red	0.68 0.44	-1.29 1.45	-1.89	-0.31	2.42 0.21	0.286 0.158	0.559 0.419	0.545	0.641
mxfacslp		The mean value of the slope in the range spanning the maximum drainge area recorded (maxFac) and maxFac - 10 ¹	diamond									
grad100_10	S-A	The slope of the line connecting avslp_1_10 with avslp_10_100	purple line	0.52	-1.48	-0.86	0.30	1.83	-0.030	0.023	-0.173	0.058
grad100_1000	S-A	The slope of the line connecting avslp_10_100 with avslp_100_1000	purple line	0.36	-1.12	-1.16	0.06	1.61	0.157	0.085	0.041	0.036
gradMax_10_4	S-A	The slope of the line connecting mxslp with slp10_4	not marked	0.09	0.51	-0.62	-0.57	0.16	-0.140	-0.087	-0.062	-0.07′
gradMax_all	S-A	The slope of the line connecting mxslp with mxfacslp	red line	0.43	-0.46	0.58	0.17	-0.09	-0.144	-0.090	-0.089	-0.084
CAD50pc	CAD	The value of the probability at a fractional drainage area of 0.5	purple square	0.25	-0.77	-1.46	-0.18	1.64	-1.202	-0.844	-0.319	-0.24
CAD75pc	CAD	The value of the probability at a fractional drainage area of 0.75	yellow triangle		-0.27	0.47	1.23	-0.38	-1.857	-1.737		-1.32
cad1000		The value of the probability at an absolute drainage area of 1000 m ²	not marked	1.37	-0.19			-0.18	-1.510	-1.212		-0.37
maxDCad	CAD	The height of the tallest point in the rotated CAD plot	not marked	-0.64	-3.01	-1.56	1.85	3.05	0.955	1.582	2.053	2.444
maxArCAD	CAD	The fractional drainage area at which maxDCad occurs	red diamond	0.06	-0.07	-0.27	-0.08	0.25	0.816	0.725	0.687	0.683
areaUCad	CAD	The area underneath the rotated CAD plot	not marked	0.19	3.13	2.05	-1.39	-3.46	0.293	0.540	0.628	0.674
mxCadPkh	AD	The height of the tallest peak in the AD plot	blue triangle	0.15	0.42	0.27	-0.28	-0.44	2.636	2.696	2.781	2.553
mxCadPkFac	AD	The fractional drainage area at which mxCadPkh occurs	blue triangle	0.44	-0.67	-0.27		0.74	1.484	2.151	3.209	3.68
nrCadPks	AD	The number of peaks in the AD plot	not marked	0.03			-0.33		1.200	1.000	1.118	1.07
cadPkArea cadSkew	AD AD	The area underneath the tallest peak in the AD plot The skew of the AD distribution	not marked	-0.10 -0.62		0.27		-0.38	0.999 1.279	1.001 0.597	0.974	1.00
maxDi25pkH	DI25	The height of the tallest peak in	not marked green	-0.02	-0.48	0.19	0.49	0.18	1.279	2.000	2.457	3.34
mxDi25pkFac	DI25	the DI25 plot The fractional drainage area at	diamond green	0.00	-0.37			-0.08	0.419	0.646		0.65
maxDi25pkA	DI25	which mxDi25pkH occurs The area underneath the tallest	diamond not	0.21	0.01	0.29	-0.06	-0.20	0.644	0.861	0.910	0.99
di25Skew	DI25	peak in the DI25 plot The skew of the DI25 distribution	marked not marked	-0.34	-0.33	0.02	0.47	0.14	-0.610	-0.864	-1.028	-1.90
di25bim	DI25	Degree of bimodality of the DI25 distribution	not marked	0.08	-0.44	-0.05	0.20	0.32	0.045	0.011	0.008	0.002

Table 1. Summary of parameters extracted from the hydrological plots.^a

204 ^aData from two different canonical discriminant analyses are shown, A1, A2 and A3 are the 205 standardized canonical coefficients from an analysis which best separates terrestrial fluvial, 206 terrestrial debris flow, dry mass wasting on Earth and dry mass wasting from the Moon. 207 Function A1 accounts for 65% of the variation, A2 24% and A3 10%. B1 and B2 are the standardized canonical coefficients from an analysis which best separates terrestrial fluvial, 208 209 terrestrial debris flow and dry mass wasting (grouping data from the Moon and Earth). 210 Function B1 accounts for 72% of the variation and B2 23%. Absolute values of standardized 211 canonical coefficients greater than one are marked in light grey and those greater than two in 212 dark grey; parameters where any of the standardized canonical coefficients exceed one or two 213 are marked in the same way. For the four columns on the right of the table the values are 214 mean values for each group, where "fl" is terrestrial fluvial, "df" is terrestrial debris flow, "rf" is terrestrial rockfall, and "mn" is lunar. 215

216

217 First, we performed an analysis to best-separate terrestrial fluvial, debris flow, 218 rockfall and lunar slopes (analysis "A"). Second, we grouped rockfall slopes on Earth with 219 lunar slopes and re-performed the analysis (analysis "B"). We choose these specific 220 groupings, because these allowed us to create parameter space plots in which different 221 regions correspond to different gully-forming processes. We performed two analyses because 222 we wanted to confirm whether the inherent differences between the slopes with dry mass 223 wasting on the Earth (which are inevitably influenced by some water) and on the Moon 224 (which are completely dry) affected the process and thus the separation of the groupings. 225 Finally, we added the martian data onto these parameter spaces to see where they plotted. We 226 estimated the range of the adjustment to the martian data needed for reduced gravity 227 conditions. Due to the martian gully processes being unknown at this stage of the analysis, no 228 unequivocal gravity correction could be made, only an estimate of the range of possible

- corrections (see Section 2.5). The effects of the range of possible corrections are shown as
- 230 lines extending from the martian gully data points in Fig. 3. We also performed a sensitivity
- analysis to test the robustness of our analysis, which is illustrated by the ellipses in Fig. 3 and
- is fully detailed in the Supplementary Text and in Fig. S1.

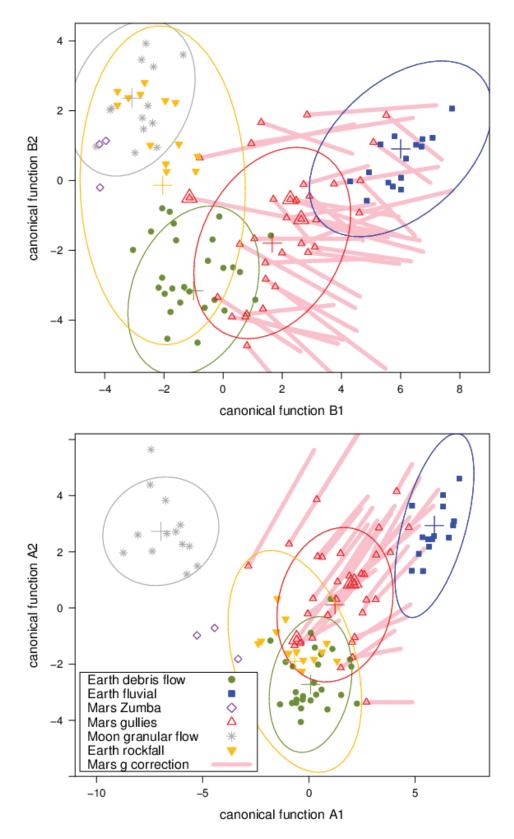


Figure 3. Results of the canonical discriminant analyses. Points labelled as "Zumba Crater"
are located on martian slopes without gullies, but with evidence of mass wasting. The ellipses
are the 68% confidence interval for the corresponding color group in the legend, with the

237 cross being the mean value – both take into account the datapoints shown here and also those 238 data from the error analyses detailed in the Supplementary Text and Fig. S1. Top: plot of the 239 first two canonical functions (A1 and A2) which best separate terrestrial fluvial, terrestrial 240 debris flow, lunar slopes and terrestrial rockfall. Bottom: plot of the two canonical functions (B1 and B2) which best separate terrestrial fluvial, terrestrial debris flow and grouped lunar 241 242 slopes and terrestrial rockfall slopes. The lines extending away from the martian gully 243 datapoints indicate the direction in which the data would shift if the effect of reduced martian 244 gravity is taken into account. However, because of the uncertainty of process in martian 245 gullies we cannot give an exact magnitude for this shift (see Section 2.5). The double-246 triangles on three of the martian datapoints indicate three catchments in Istok crater where 247 debris flow morphologies have been identified by Johnsson et al. (2014). The canonical 248 coefficients which make up the canonical functions A1, A2, B1 and B2 are given in Table 1. 249

250 **2.4 Gravity scaling**

To account for the difference between terrestrial and martian gravity, a process has to be assigned to a system in order to infer the effect on the landscape. The equations governing that process can then be used to estimate the effect it has on the landscape. Here, we explain our rationale for applying gravity scaling to (i) dry mass wasting, (ii) fluid flows (including fluvial processes, debris flow and fluidized granular flow).

For dry granular flows some authors have found that the dynamic angle of repose is independent of gravity (Atwood-Stone and McEwen, 2013), whereas others have found that it reduces by $\sim 10^{\circ}$ (Kleinhans et al., 2011) under martian gravity. We find no significant difference between the slope angle of loose material on the walls of fresh impact craters on the Moon, talus slopes on Mars and talus on Earth, as demonstrated in Fig. 4; hence we assume that any piled loose material should come to rest at the same angle on Mars as on the Earth. Therefore we make no adjustment to the terrain analysis plots to account for the effectof changing the gravitational acceleration on dry mass wasting processes.

For clear water flows eroding into bedrock (detachment limited), the erosion rate in volume per unit channel area per time is a power law function of the basal shear stress (Snyder et al., 2000; e.g., Whipple and Tucker, 1999), the so-called "stream-power law":

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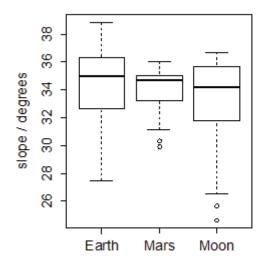
$$E = k_b \tau^a \tag{1}$$

where k_b is a dimensional coefficient dependent on rock resistance, dominant erosion process 268 269 and sediment load, and a is a positive, process-dependent constant (the reciprocal of the Hack 270 exponent). Previous analyses (Irwin et al., 2005; Som et al., 2009) have revealed that, for the 271 same discharge (which should scale with drainage area) and slope, channels on Mars should 272 be larger than their terrestrial equivalents in order to compensate for the reduced velocity 273 under reduced gravity. If we instead fix the channel dimensions, then channels of the same 274 dimensions will be found on higher slopes on Mars compared to Earth. As fluvial channel 275 initiation can be considered as a result of exceeding a critical velocity, or shear stress 276 (Horton, 1945; Moore et al., 1988) then, on Mars for any given drainage area (discharge), the 277 slope would need to be higher compared to Earth, everything else being equal. This was also 278 suggested by the analysis and data of Lanza et al. (2010). Conway et al. (2011a) find that the 279 appropriate slope-shift for equilibrium bedrock fluvial erosion under steady-state uplift 280 conditions in slope-area plots, for a given drainage area, should be +1/3. However, they did 281 not take into account the potential effects of g on the dimensional constants, which should 282 somewhat counteract this shift. Therefore in our analyses we take the shift of 1/3 as the extreme value. 283

When the bedload cover of the flow is taken into account (transport limited), there are a number of different formulations of the stream power law; many take a form similar to (Densmore et al., 1998; Lavé and Avouac, 2001):

287
$$E = K (\tau^* - \tau^*_c)$$
 (2)

where *K* is an erodibility coefficient, τ^* is given by $\tau / (\rho_s - \rho) g D_{50}$ and τ^*_c is a Shield's-Stress-like threshold dimensionless shear stress, where ρ_s is the density of the grains and D_{50} is their modal size. In this case, because τ^* has *g* in the denominator and in the numerator (from Eq. 1), there is no effect on erosion rate of changing gravity.



292

293 Figure 4. Box plots of measurements of the slope of talus on Earth (35), Mars (30) and the 294 Moon (22). The bar across each box is the median value, the extent of the box delimits the 295 interquartile range, and the whiskers indicate the range, while the points are outliers - values 296 which are further than 1.5 interquartile ranges from the quartiles. Each measurement was 297 taken over a span of ~50 m on part of the hillslope that was smooth or contained loose boulders within the image. On Earth ten measurements were taken in the Westfjords, ten in 298 299 St. Elias and 15 in Quebrada de Camarones. On Mars, ten measurements were taken in 300 Zumba Crater, ten on the north-facing slope of Istok Crater and ten in Juventae Chasma (DT1EA_003434_1755_003579_1755_U01, credit USGS). On the Moon ten measurements 301 302 were taken in "Unnamed Fresh Crater West of Isaev Crater", seven in "Unnamed Fresh 303 Crater West of Saenger" and five in Moore F Crater (NAC_DTM_MOOREF1_E370N1850,
304 credit Arizona State University).

305

For debris flows, if we assume for simplicity a single fluid rheology, then there are two possible modes. Firstly, the case of an erodible non-cohesive bed, where the erosion rate is determined by the flow's ability to erode grains. This is determined by a critical shear stress:

$$\tau_{c} = (\rho_s - \rho) g D_{50} \cos\theta \tag{3}$$

The ratio of the bed shear stress (Eq. 1) to the critical shear stress (Eq. 3) is a constant given by:

313

$$\tau / \tau_c = \rho \ H \tan\theta / \left[\left(\rho_s - \rho \right) D_{50} \right] \tag{4}$$

which is not dependent on gravity. Secondly, where the bed is cohesive, the critical shear stress becomes a constant, hence the stress required to erode the bed becomes dependent on gravity, and therefore so does the inclination of the bed.

317 This formulation for debris flows is over-simplistic and more complex schemes have 318 been proposed, such as separating the shear-stresses imposed by the granular component and 319 fluid component of the flow (Iverson et al., 2010). In Iverson's formulation the fluid part is a 320 Bingham fluid with a Coulomb-like failure, and the granular part includes a shear stress term 321 similar to Eq. 1 and also a pore-pressure term. Takahashi (1981, 1978) proposed a model 322 informed by Bagnold's concept of dispersive stress included in a water-saturated inertial 323 grain flow, where again a Coulomb-like failure is included. Even in these more complex 324 cases a decrease in gravitation acceleration acts to decrease basal shear stress and never acts 325 to increase it, despite the exact influence being more complicated to calculate.

326 Under a steady-state, these erosion-rate laws can be converted into a change in local327 slope. However, in ephemeral systems we have studied on Earth (and almost certainly gullies

328 on Mars are ephemeral), this assumption cannot be made. The erosion rate for both fluvial 329 and debris flow processes can depend on gravitational acceleration. In all cases, this acts to 330 increase the local slope for a given drainage area (as a proxy for discharge) on Mars 331 compared to Earth, even if an assumption of steady-state cannot be made. Hence we conclude 332 that in all cases the adjustment for gravity shown in Fig. 3 has to be in the direction indicated, 333 and is most likely to be at the lower end of the range indicated by the lengths of the lines.

334 In summary, for a cohesive bed (e.g., bedrock), cohesion dominates gravity, so 335 gravity scaling is required, but a non-cohesive bed, the shear stress required for erosion 336 depends upon the weight of individual particles, so the effects of gravity cancel out. We have 337 no *a priori* knowledge of whether the martian gully beds are cohesive or not, so exact scaling 338 cannot be applied. Instead, to provide an indication of how gravity scaling affects the data in 339 Fig. 3, we use an estimated maximum value of 1/3. This is likely to be an overly exaggerated 340 maximum, as shown by the slope-area analysis of channel initiation in gullies on Mars by 341 Lanza et al. (2010), who find differences in material properties and environmental factors are 342 likely to be more influential on the slope-area data than gravity scaling.

343

344 **3.0 Interpretations and Discussion**

345 Our earlier study (Conway et al., 2011a) showed that some martian gullies qualitatively resembled terrestrial debris flows in terrain analysis data, and that this was not due to crater-346 347 wall topography producing spurious debris-flow like results. For the first time, our new 348 analysis demonstrates quantitatively that, when using terrain parameters that best separate 349 granular flow landforms from fluvial or debris flow landforms, martian gullies overlap the 350 parameter space for both debris flow and fluvial gullies on Earth (Fig. 3). The majority of the 351 martian gully data cluster between the fluvial and debris flow domains, suggesting a blend of processes. Importantly though, our analysis shows that martian gullies have very different 352

topographic properties from slopes with gully-like features on the Moon – a "dry granular
flow" analog.

355 Any adjustment to account for the effect of reduced martian gravity, shifts the data 356 further from the lunar slopes and further into the terrestrial fluvial domain, particularly for 357 canonical function A1, with which the martian gullies completely overlap the fluvial domain. 358 However, this transformation shifts martian gullies with identifiable debris flow 359 morphologies (Johnsson et al., 2014) away from the terrestrial debris flow data in Fig. 3. This 360 perhaps suggests that the necessary adjustment for gravity may only be small for debris flow 361 processes, which are one of the best-articulated mechanisms for gullies on Mars (e.g., 362 Costard et al., 2002; de Haas et al., 2015b).

363 To check the method, we also examined martian slopes without gullies, to confirm 364 that these fall within the domain of dry processes. We found that non-gullied terrain within 365 craters on Mars does not produce signals resembling those of fluvial or debris flows on Earth: 366 the walls of the fresh impact crater Zumba plot between the lunar data and Earth rockfall data 367 on Fig. 3 – in agreement with earlier studies (Conway et al., 2011a). This contrasts to the results of Hobbs et al. (2014), who found that pre-existing topography has a detectable 368 369 influence on the two-dimensional long profiles of martian gullies. Our analysis shows that, 370 when considered in three dimensions, the shape is dominated by the active process.

The spread of the terrestrial data in Fig. 3 reflects not only the inevitable mixing of different process signals, but also the effects of different substrates, including differing amounts and types of bedrock outcrop, soil types and thickness, and vegetation types and cover (see Supplementary Material for full description of the terrestrial sites). The lunar data have a similar scatter, which also probably reflects the geological diversity of the different sample sites, including different geological units, amount of bedrock outcrop, regolith thickness and maturity, presence and amount of impact melt, and amount of ejecta cover.

378 Similar factors are also likely to be influencing the martian data. Similarly to Earth, many 379 gully alcoves incise into the competent bedrock of their host crater wall (Aston et al., 2011; 380 de Haas et al., 2015a, 2015c; Okubo et al., 2011),, which can have a range of ages, type, 381 weathering state and structure. On Mars, gullies are often incised into a surface-draping unit, called the latitude dependent mantle (LDM; Christensen, 2003; Conway and Balme, 2014; 382 383 Dickson et al., 2015; Head et al., 2008; Levy et al., 2011), which previous work has 384 interpreted to comprise either massive ice, or ice-rich sediment. None of our terrestrial sites 385 are located on massive ice, but many of them have discontinuous mountain permafrost 386 (Adventdalen, Svalbard; St. Elias, Alaska; Front Range, Colorado; Tindastóll, Iceland), 387 which has similar mechanical behavior to erosion. Although the substrates in the three sites 388 are not strictly analogous, we feel that by choosing a wide variety of sites we have captured 389 enough of the variability of the substrate (i.e., a wide range of cohesion and erodibility) in 390 order to consider substrate as a secondary factor compared to the more dominant effect of 391 process.

392 The even larger spread of the martian gully data in Fig. 3 compared to the terrestrial 393 and lunar sites reflects a) their variability of form and setting, and b) either catchments with 394 mixed processes, or long periods of quiescence allowing dry processes to gradually overprint 395 other processes. We have included gullies that deeply incise the ice-dust mantle (Conway and 396 Balme, 2014), those in polar pits, isolated gullies, grouped gullies, gullies that form dense 397 coalescing networks, and those that possess thin channels. The systems we have selected on 398 Earth (with the exception of the sites in the Atacama) are almost constantly transforming 399 under the influence of water-driven processes, yet maintain the process signal. On Mars, dry 400 mass-wasting (CO₂-driven, or not), aeolian processes (and perhaps long-term creep) might be 401 expected to modify the topography post-emplacement (de Haas et al., 2015d) and thus

402 contribute to scatter in the data, yet this has not occurred sufficiently to overprint the process403 signal.

404 Another possible cause of the scatter of the data is the potential for metastable water 405 on Mars (Hecht, 2002). On Earth, water is the central component of both fluvial and debris 406 flow processes, but on Mars water can be metastable (Hecht, 2002), being subject to both 407 freezing and boiling, which can change its behavior with respect to stable water (Conway et 408 al., 2011b; Jouannic et al., 2015; Massé et al., 2016). As previous laboratory work has shown, 409 the principle effect of boiling and freezing is to change the infiltration rate - an effect that can 410 be mimicked by changing the properties of the substrate. Therefore we expect that the 411 potential effect of metastability on water on Mars would introduce a variability of the same or 412 lesser magnitude than that of substrate type, which is discussed above.

413 We discussed briefly in the introduction the possibility that gullies on Mars can be 414 modified, or even formed by CO₂ sublimation driven processes. We consider that dry 415 granular flow is the most analogous of our sampled processes to a putative CO₂ sublimation driven process, because without special circumstances (a confining lid, or inclusion of a large 416 417 portion of mobile solid CO₂ within the flow) flow triggered by CO₂ sublimation would rapidly loose its pore pressure through gas escape and therefore convert into a non-fluidized 418 419 dry granular flow. Pyroclastic flows on Earth have been cited to be possible analogues for 420 CO₂ sublimation driven flows (Pilorget and Forget, 2016), yet the energy involved in such flows can be in excess of 10^8 Wm⁻² (Smil, 2008), tiny in comparison to insolation on Mars 421 (the driver of CO₂ sublimation) which can usually generate $< 700 \text{ Wm}^{-2}$ even with the most 422 423 optimal combination of slope, orientation and orbital parameters (Lewis et al., 1999). Cedillo-424 Flores et al. (2011) estimated that CO₂ sublimation would be sufficient to mobilize sand 425 grains, whose mass is significantly below that of the boulder-grade material often found in gully-deposits on Mars, both old (de Haas et al., 2015d) and new (Dundas et al., 2015). 426

427 Pilorget and Forget (2016)'s model, which requires a confining lid of CO₂ slab ice, 428 was optimized for gullies found on sand dunes, but they inferred using analogy to pyroclastic 429 density currents that larger material could be mobilized. Without further modelling, or 430 experimental work to clarify the exact physical transport mechanism involved in CO₂ 431 sublimation driven flows, a detailed discussion would remain highly speculative. However, 432 given the current state of knowledge, we feel that taking dry granular flows as an analogy to 433 putative Mars CO₂-driven flows is reasonable. Using this analogy, our work therefore implies 434 that CO₂ sublimation driven flows are a secondary process influencing the morphology of the 435 non-sand dune martian gullies studied here, and could be a factor in introducing scatter into 436 the data in Fig. 3. For gullies in poorly consolidated sand dune slip faces this process might 437 be dominant, as suggested by recent observations (e.g., Diniega et al., 2013), but this type of 438 gully was not included in this study.

439

440 **4.0 Conclusions**

Our results support the interpretation that liquid water was inherent to the process that formed martian gullies. This conclusion is based upon a new method, yet is in agreement with many other studies that examine the topographic profiles (Conway et al., 2014), morphology (Gallagher et al., 2011; e.g., Johnsson et al., 2014; Levy et al., 2010), and geological and physiographic settings (e.g., Costard et al., 2002; Dickson et al., 2015; Head et al., 2008) of martian gullies. Liquid water must have been available in sufficient quantities to produce this scale of landform, as we argue below.

In terms of the volume of water required, debris flows on Earth are generated by the development of excess pore pressure inside a body of sediment; either produced by oversaturation of the ground by rainfall or snowmelt, or by overland water-flow inside a constraining environment which then infiltrates the sediments - the so-called 'fire-hose'

452 effect (Johnson and Rodine, 1984). Debris flow initiation is aided by the presence of clay-453 sized material, which helps to augment pore pressures (Iverson, 1997). Loose surface 454 sediments and fine-fractions are both present on Mars (Cabrol et al., 2014), meaning that 455 debris flow is certainly a plausible process. However, low-volume water flows on Earth 456 cannot produce substantial debris flow, as they are unable to entrain larger particles (de Haas 457 et al., 2014), despite the flows themselves containing more water per unit volume. Substantial 458 boulder-grade materials are often seen within martian gullies (de Haas et al., 2015d). This 459 means that, whether generated by fluvial or debris flow processes, the formation of martian 460 gullies must have involved substantial quantities of water, i.e. centimeters of melt production 461 over the alcove-zone, as calculated in (de Haas et al., 2015c).

462 Gullies are known to be geologically recent features (Reiss et al., 2004; Schon et al., 463 2009), so future research should focus on elucidating the timing of gully-forming events with 464 respect to changes in Mars' orbital parameters (and hence possibly climate change; Head et 465 al., 2003), the amounts of water involved, and the mechanism of water-release. Global 466 Climate Models of Mars have so far failed to predict sufficient melting from precipitation to 467 produce gullies under recent (last ~10Ma) climate conditions, hence these results show that 468 we need to revisit our understanding of the recent martian climate. Our work also maintains 469 the designation of gullies as "special regions" (Kminek et al., 2010) under planetary 470 protection rules, whereby the risk of contamination by terrestrial biota is considered too high 471 to be able to send space missions to these regions. It is important not to contaminate these 472 regions, as stratigraphic observations point to intermittent, yet repeated, episodes of activity 473 in gullies (Dickson et al., 2015; Schon and Head, 2011), meaning that they represent 474 intermittently habitable environments and a possible niche for the survival of life on Mars. 475 Finally, this work reveals that quantifying the 3D shape of landforms opens-up a new avenue for remotely differentiating between dominant processes acting on planetary surfaces. 476

Although presently such analyses are not widely used, future developments in computational
techniques and data processing (e.g., Grieve et al., 2016) promise to make such techniques
more widely accessible and usable.

480

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