

1 Do subglacial bedforms comprise a size and shape continuum?

2 *Jeremy C. Ely*¹, Chris D. Clark¹, Matteo Spagnolo², Chris R. Stokes³, Sarah L. Greenwood⁴,
3 Anna L. C. Hughes⁵, Paul Dunlop⁶ and Dale Hess⁷

4 ¹ Department of Geography, University of Sheffield, Sheffield, S10 2TN, UK,
5 j.ely@sheffield.ac.uk

6 ² School of Geosciences, University of Aberdeen, Aberdeen, AB24 3UF, UK

7 ³ Department of Geography, Durham University, Durham, DH1 3LE, UK

8 ⁴ Department of Geological Sciences, Stockholm University, Stockholm, SE-106 91, Sweden

9 ⁵ Department of Earth Science, University of Bergen and Bjerknes Centre for Climate
10 Research, Bergen, N-5020, Norway

11 ⁶ School of Geography and Environmental Sciences, Ulster University, Coleraine BT52 1SA,
12 UK

13 ⁷ Department of Earth and Environmental Sciences, The University of Rochester, Rochester
14 New York, NY 14627, United States

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16 **Abstract**

17 Understanding the evolution of the ice-bed interface is fundamentally important for
18 gaining insight into the dynamics of ice masses and how subglacial landforms are created.
19 However, the formation of the suite of landforms generated at this boundary — subglacial
20 bedforms — is a contentious issue that is yet to be fully resolved. Bedforms formed in
21 aeolian, fluvial, and marine environments either belong to separate morphological

22 populations or are thought to represent a continuum of forms generated by the same
23 governing processes. For subglacial bedforms, a size and shape continuum has been
24 hypothesised, yet it has not been fully tested. Here we analyse the largest data set of
25 subglacial bedform size and shape measurements ever collated (96,900 bedforms). Our
26 results show that flutes form a distinct population of narrow bedforms. However, no clear
27 distinction was found between drumlins and megascale glacial lineations (MSGs), which
28 form a continuum of subglacial lineations. A continuum of subglacial ribs also exists, with no
29 clear size or shape distinctions indicating separate populations. Furthermore, an
30 underreported class of bedform with no clear orientation to ice flow (quasi-circular bedforms)
31 overlaps with the ribbed and lineation continua and typically occurs in spatial transition zones
32 between the two, potentially merging these three bedform types into a larger continuum.

33 **1. Introduction**

34 The interface between moving water, air, or ice and unconsolidated sediment is often
35 populated by undulating landforms, collectively referred to as bedforms (e.g., Allen, 1968;
36 Wilson, 1973; Aario, 1977; Rose and Letzer, 1977). Rather than being individuals, bedforms
37 commonly occur in swathes or fields: configurations which cover large portions of Earth's
38 deserts, river beds, and ocean floors (e.g., Costello and Southard, 1981; Amos and King,
39 1984; Carling, 1999), as well as the surfaces of extraterrestrial bodies (Cutts and Smith, 1973;
40 Kargel and Strom, 1992; Radebaugh et al., 2008). The abundance of subglacial bedforms on
41 deglaciated terrain (e.g., Aylsworth and Shilts, 1989; Ottesen et al., 2005; Greenwood and
42 Clark, 2008; Larter et al., 2009; Trommelen and Ross, 2010; McHenry and Dunlop, 2015),
43 their emergence from receding ice margins (Johnson et al., 2010), and their repeated
44 detection by geophysical surveys of contemporary ice-sheet beds (Rooney et al., 1987; Smith
45 et al., 2007; King et al., 2009) indicates that they are a key component of the subglacial
46 environment, where processes that regulate ice flow occur (Alley et al., 1986; Englehardt and

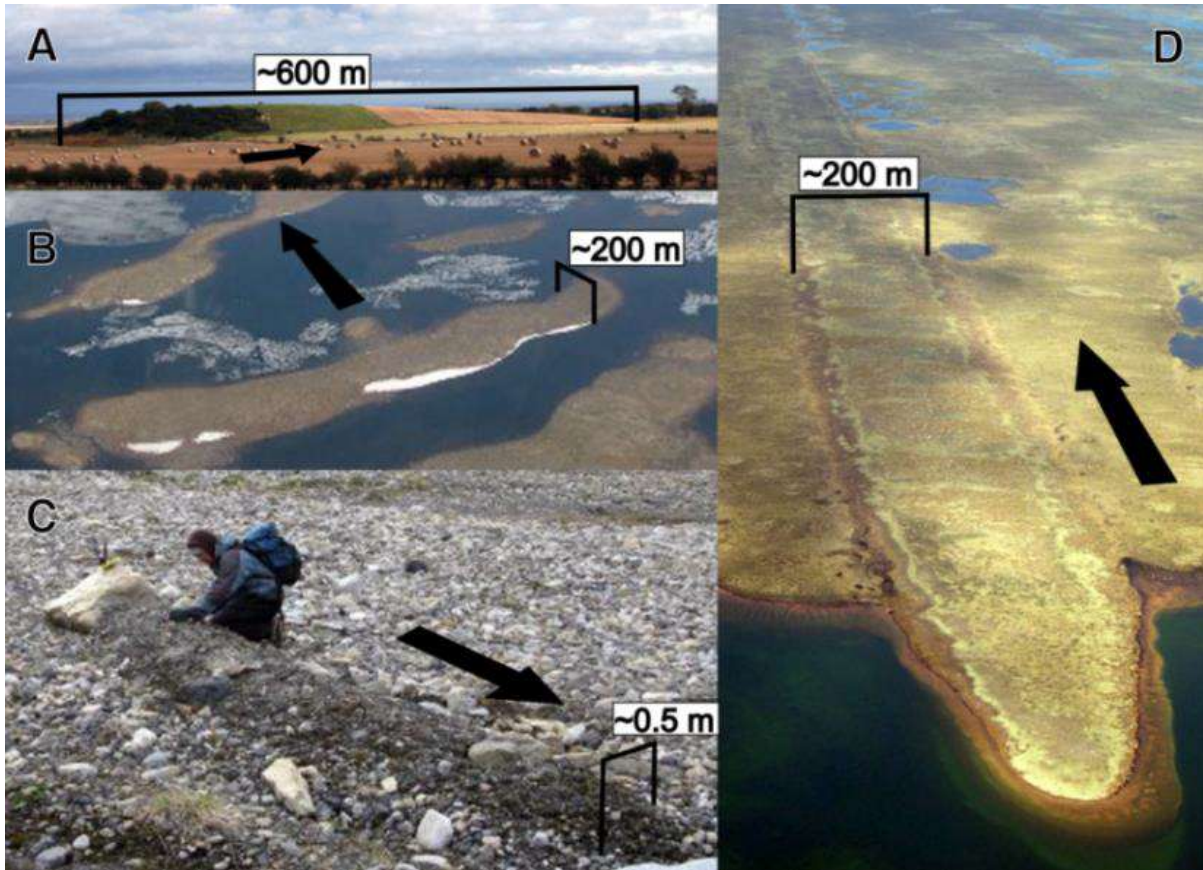
47 Kamb, 1998; Kleman and Glasser, 2007). Elucidating the genesis of subglacial bedforms is
48 an important goal in geomorphology and for understanding ice dynamics.

49 In addition to their composition, the morphological properties of bedforms provide
50 constraints for hypotheses and models of their formation (e.g., Jackson, 1975; Clark et al.,
51 2009; Worman et al., 2013). Fluvial, aeolian, and marine bedforms can form distinct, often
52 hierarchical, populations (Allen, 1968). In deserts, for example, discrete populations of
53 bedforms are found, increasing in size from ripples to dunes then draas (Wilson, 1973;
54 Lancaster, 1988). Conversely, bedforms can also belong to populations within which there
55 are no clear size distinctions, forming size and shape continua [e.g., aeolian ripples (Ellwood
56 et al., 1975), aeolian dunes (Lancaster, 2013, p. 159), and subaqueous dunes (Ashley, 1990)].
57 For flutes, drumlins, megascale glacial lineations (MSGLs), and ribbed moraines, whether
58 they form separate distinct morphological populations or form a single continuous size and
59 shape population with no natural breaks (i.e., a size and shape continuum) is unclear.

60 Subglacial bedforms are often subdivided and named on the basis of perceived
61 distinctions in scale and morphology. Commonly, subglacial bedforms that form aligned with
62 ice-flow direction are divided into drumlins, MSGLs, and flutes (Fig. 1); while ribbed
63 moraines and megaribs form transverse to flow direction (Fig. 1; Greenwood and Kleman,
64 2010; Klages et al., 2013). Quasi-circular bedforms, which have no clear orientation to ice-
65 flow direction, are less frequently studied but have been previously noted (Hill, 1973;
66 Markgren and Lassila, 1980; Bouchard, 1989; Smith and Wise, 2007; Greenwood and Clark,
67 2008). Beyond this, a wealth of further nomenclature exists (e.g., megafutes, fluting,
68 megadrumlins, and minor ribbed, Blatnick, Rogen, and Niemsel moraines).

69 Despite the array of terms applied to the varieties comprising subglacial bedforms, a
70 long-standing hypothesis is that they actually belong to a continuum of size and shape (Aario,

71 1977; Rose and Letzer, 1977; Rose, 1987). This ‘continuum hypothesis’ was originally based
72 upon observations of spatial transitions between subglacial bedform types and orientations
73 along the direction of ice flow, suggesting a single continuum of form stretching from ribbed
74 moraine, through quasi-circular forms, to drumlins (Aario, 1977; Markgren and Lassila,
75 1980; Punkari, 1984). However, subsequent work on the continuum hypothesis has focussed
76 solely upon flow-aligned subglacial bedforms (e.g., Rose, 1987; Stokes et al., 2013b).
77 Furthermore, the relatively recent discovery of ‘megascale’ subglacial bedforms (Clark,
78 1993; Greenwood and Kleman, 2010) might imply a distinct variety of bedform rather than
79 end-members of a continuum. Morphological studies often focus upon previously labelled
80 categories of subglacial bedforms [e.g. drumlins in Clark et al. (2009) and Maclachlan and
81 Eyles (2013); ribbed moraines in Hättestrand (1997) and Dunlop and Clark (2006b); MSGL
82 in Spagnolo et al. (2014a)]. A comprehensive study that looks at all landform types together
83 to compare and contrast their size and shape is missing. Here, we present and analyse a data
84 set of 96,900 size and shape measurements of subglacial bedforms from numerous locations,
85 spanning the range of types in the literature, in order to investigate whether there is a
86 continuum of subglacial bedforms or whether separate size and shape populations exist. Note
87 that we do not consider bedforms composed purely of bedrock (e.g., whalebacks, roche
88 moutonnées, megagrooves), nor do we consider hybrid forms such as crag and tails, as they
89 are often regarded as different from subglacial bedforms created in sediment (e.g., Dionne,
90 1987; Stokes et al., 2011; Lane et al., 2015).



91

92 Fig. 1. Different types of subglacial bedform and their orientation to ice-flow direction (denoted by
 93 black arrow). Scales are approximate. (A) A drumlin in NE England. These streamlined hills are
 94 typically 250-1000 m along-flow and 120-300 m across-flow (Clark et al., 2009). (B) Transverse
 95 ridges, termed ribbed moraine, in Nunavut, Canada, typically 300-1200 m across-flow and 150-300 m
 96 along-flow (Hättestrand and Kleman, 1999). (C) A flute formed parallel to ice-flow direction, Svalbard.
 97 Note the accumulation of sediment in the lee of a boulder. (D) A MSGL in Nunavut, Canada. MSGLS
 98 typically are 100-200 m across-flow and 1-9 km along-flow (Spagnolo et al., 2014a) but have been
 99 reported to be much longer (e.g., 180 km, Andreassen et al., 2008). All photographs from
 100 www.shef.ac.uk/drumlins.

101 2. Data and Methods

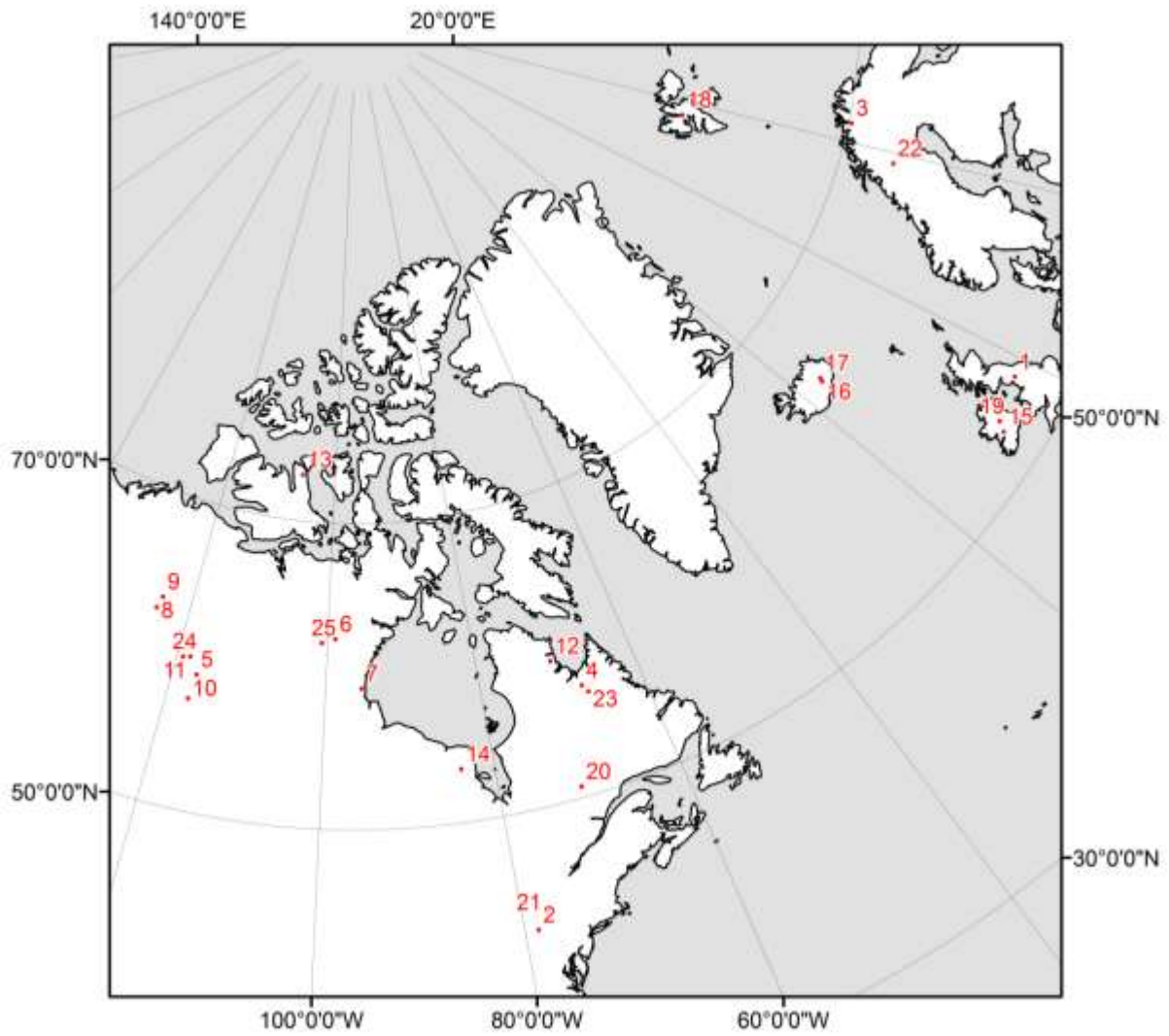
102 2.1. Data

103 A database of 96,900 mapped subglacial bedforms was compiled from previous studies
 104 and additional mapping, which was conducted using standard remote sensing techniques

105 (Table 1). A variety of reported bedform morphologies from a wide range of sites were
106 chosen from the literature (Fig. 2; Table 1). Mapped bedforms were grouped by locality and
107 reported type (i.e., as reported in previous studies) so that further analysis could ascertain the
108 similarities or differences between these types. At each location, the highest resolution
109 remote sensing data available were used to map and derive landforms metrics (Table 2). Only
110 data with resolution higher than 30 m were used, as measurements of bedform length and
111 width derived from coarser resolution data have been shown to misrepresent subglacial
112 bedform size and shape (Napieralski and Nalepa, 2010). Each bedform is represented in our
113 data set as a smooth polygon, manually digitised directly into a geographic information
114 system (GIS) around the break of slope on hill-shaded digital elevation models illuminated
115 from multiple directions (Smith and Clark, 2005; Hughes et al., 2010). On satellite imagery,
116 landforms are detectable as a change in vegetation and/or soil moisture (e.g., Spagnolo et al.,
117 2014a). Automated mapping techniques (e.g., Saha et al., 2011; Maclachlan and Eyles, 2013)
118 were avoided as they require predefinition of parameters such as shape and scale and thus
119 would introduce bias into our results.

120 Table 1. Location of mapped subglacial bedforms; all bedforms have previously been described in the
 121 literature. Where mapping was not available from the original study a '#' denotes that further mapping
 122 was conducted at a previously described site

Reported bedform type (number of bedforms)	Location	Central coordinates (decimal degrees)	Number of bedforms	Data set	Study describing site (# denotes mapping has not previously been analysed)	Location number
Drumlins (n = 42,495)	Britain	54.069, 2.258	30,304	NEXMap DEM	Hughes et al., 2010.	1
	New York State, USA	44.830, -75.268	5,650	USGS NED	Hess and Briner, 2009.	2
	Alta, Norway	69.476, 23.139	1,638	Landsat ETM+	Spagnolo et al., 2010.	3
	Ungava Bay, Quebec, Canada	57.176, -67.299	5,903	Landsat ETM+	Spagnolo et al., 2010.	4
MSGL (n = 31,668)	Cameron Hills, Alberta, Canada	59.950, -117.826	581	SPOT	Brown et al., 2011. #	5
	Dubawnt Lake, Nunavut, Canada	64.171, -100.415	17,038	Landsat ETM+	Stokes et al., (2013b)	6
	Eskimo Bay, Nunavut, Canada	61.387, -94.829	4,499	SPOT	Clark, 1993. #	7
	Great Bear Lake, NWT, Canada	64.454, -122.069	1,260	SPOT	Winsborrow et al., 2004. #	8
	Haldane Ice Stream, NWT, Canada	67.008, -121.299	489	SPOT	Winsborrow et al., 2004. #	9
	Liard Ice Stream, NWT, Canada	61.217, -121.701	340	SPOT	Brown et al., 2011. #	10
	Great Slave Lake, NWT, Canada	61.703, -116.576	784	SPOT	Brown et al., 2011. #	11
	Payne Bay, Quebec, Canada	59.618, -70.430	531	SPOT	This study. #	12
	M'Clintock Channel Ice Stream, Canada	72.743, -105.753	2,796	Landsat ETM+	Storrar and Stokes, 2007. #	13
	West James Bay Ice Stream	54.478, -87.280	3,350	SPOT	Clark, 1993. #	14
Quasi-Circular Bedforms (n = 1,955)	Ireland	53.723, -7.803	1955	Landmap DEM, SRTM, Landsat ETM+	Greenwood and Clark, 2008.	15
Flutes (n = 664)	Skeiðarajökull, Iceland	63.977, -17.219	101	NERC ARSF Aerial Photography	Waller et al., 2008. #	16
	Breiðamerkurjökull, Iceland	64.071, -16.327	131	NERC ARSF Aerial Photography	Evans and Twigg, 2002. #	17
	Conwaybreen, Svalbard	78.994, 12.486	432	NERC ARSF Aerial Photography	This study. #	18
Ribbed Moraine (n = 18,384)	Ireland	53.723, -7.803	5464	Landmap Dem, SRTM, Landsat ETM+	Greenwood and Clark, 2008.	19
	Lac Naococane, Quebec, Canada	52.972, -70.921	501	Landsat	Dunlop and Clark, 2006a.#	20
	St. Lawrence Valley, New York	44.831, -75.268	921	USGS NED	Carl, 1978. #	21
	Lake Rogen, Sweden	62.328, 12.394	3,357	Landsat ETM+	Dunlop and Clark, 2006b. #	22
	Ungava Bay, Quebec, Canada	59.618, -70.430	7582	Landsat ETM +	Dunlop and Clark, 2006b. #	23
	Great Slave Lake, NWT, Canada	61.703, -116.576	559	SPOT	Brown et al., 2011. #	24
Mega Subglacial Ribs (n = 733)	Keewatin, Canada	64.171, -100.415	733	Landsat ETM+ and SPOT	Greenwood and Kleman, 2010.	25



124

125 Fig. 2. Location of mapped subglacial bedforms. Numbers refer to Table 1.

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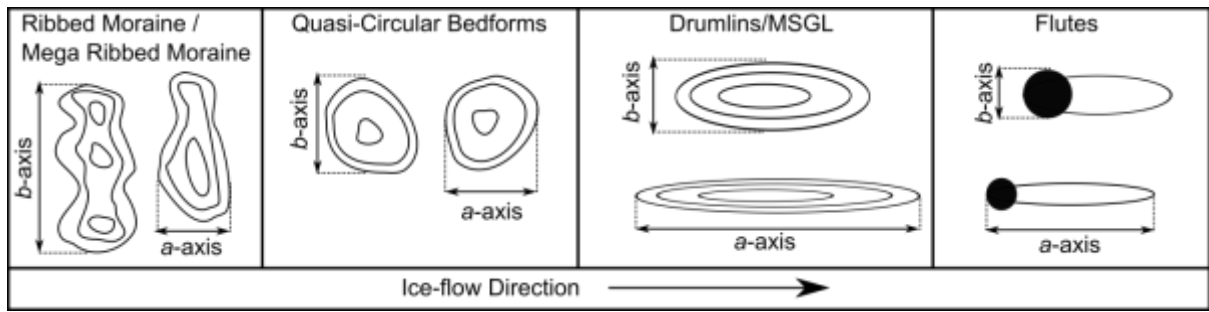
127 Table 2. Data type and source for the mapping described in Table 1.

Data set	Type of data	Horizontal resolution (m)	Source	
NEXTMap Great Britain™	DEM	5	http://arsf.nerc.ac.uk/	128
USGS NED	DEM	10 m	http://ned.usgs.gov/	129
Landsat ETM+	Imagery	15 Pan-chromatic, 30 Colour.	http://earthexplorer.usgs.gov/	130
SPOT	Imagery	10 Pan-chromatic, 20 colour	http://geobase.ca/	131
Landmap DEM	DEM	25	http://landmap.ac.uk/	132
NERC ARSF Aerial Photography	Imagery	0.15	http://arsf.nerc.ac.uk/	133
SRTM	DEM	30	http://earthexplorer.usgs.gov/	134

135

136 **2.2. Methods**

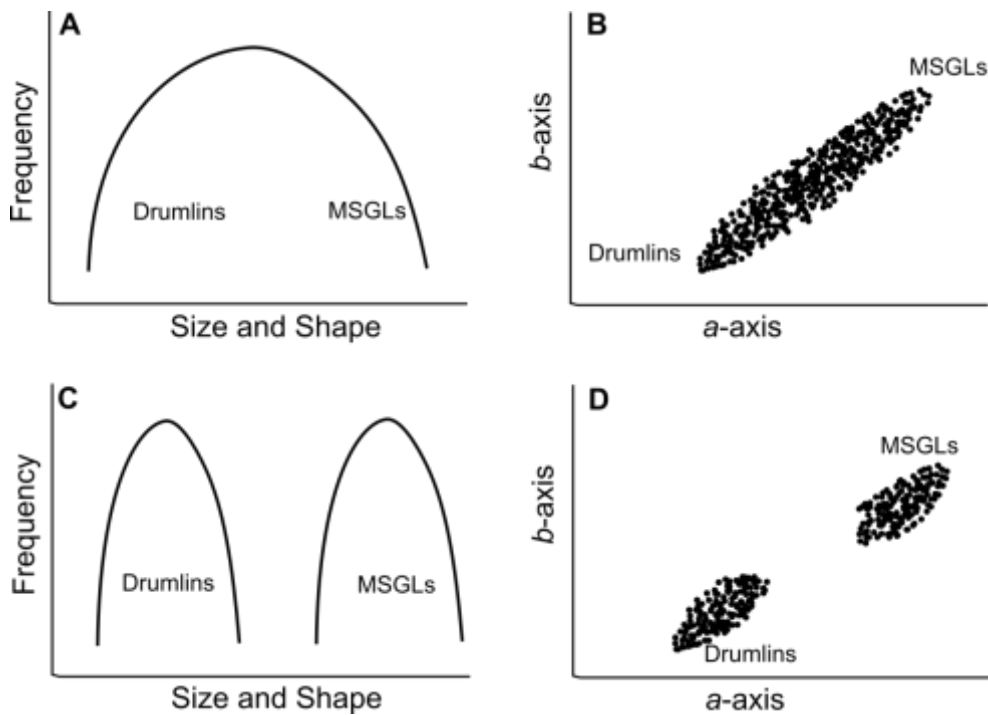
137 The length (L) and width (W) of each mapped polygon was estimated via Euler's
138 approximation for an ellipse (Clark et al., 2009). A limitation of this approximation is that it
139 slightly underestimates the length (and overestimates the width) of highly elongate or
140 irregular polygons, but this error is insignificant compared to the size of the bedforms (Clark
141 et al., 2009) and typically is less than 3%. These polygon measurements were then converted
142 into a -axis (distance down-ice) and b -axis (distance across- ice) measurements according to
143 bedform orientation to ice flow (Fig. 3). For near-circular bedforms, bedform a -axis and b -
144 axis were manually measured within a GIS using regional ice-flow patterns as an indicator of
145 flow alignment (Fig. 3). Elongation ratio, often used as a proxy for shape (e.g., Rose, 1987;
146 Clark et al., 2009; Dowling et al., 2015), was simply measured as a -axis divided by b -axis.



147

148 Fig. 3. Schematic of derived bedform axes.

149 Testing the subglacial bedform continuum hypothesis requires the detection and
 150 definition of populations within our data set. If the variously-named types of bedforms are
 151 found to vary continuously in size and shape such that, for example, a large drumlin is the
 152 same as a small MSGL, then a size and shape continuum between them exists (Figs. 4A and
 153 B). When plotted on a scatter graph, this would show a single continuous data cloud, or
 154 cluster (Fig. 4B). On the contrary, if the derived metrics reveal gaps or jumps in scale or
 155 shape then they are better interpreted as discrete phenomena (Figs. 4C and D), leading to the
 156 rejection of the continuum hypothesis. In this case, a scatter graph of bedform metrics would
 157 show several distinct clusters (Fig. 4D). Several approaches are taken here to assess the
 158 degree to which separate populations, or clusters, can be detected within our data set.



159

160 Fig. 4. Schematic of how a continuum (A and B) or different populations (C and D) may be detected in
 161 our data set. If a continuous sequence in the size and shape of bedforms exists, e.g., between
 162 drumlins and MSGs (A), then a scatter plot of their metrics would show a single cluster. If separate
 163 size and shape populations occur (C), then separate clusters would be shown on a scatter plot (D).

164 The human eye is an excellent tool for detecting clusters (Jain, 2010). As such, our first
 165 attempt at detecting clusters in our data set was to plot the data and visually assess clustering
 166 qualitatively. That said, different interpreters may see different clusters. Thus, in an effort to
 167 make our analysis more objective and quantitative we employed the density-based clustering
 168 algorithm DBSCAN (Ester et al., 1996) using the package ‘fpc’ in R statistical software. No
 169 clustering algorithm or technique is perfect because no objective definition of a cluster exists
 170 (Estivill-Castro, 2002). However, DBSCAN was chosen as it requires no predefinition of the
 171 number of expected clusters within a data set; hence it requires no prior categorisation of
 172 bedforms into separate populations. The algorithm requires two input parameters: the window
 173 size (\mathcal{E}) and the minimum number of points within a cluster (*MinPts*). In order to define dense
 174 regions (clusters) within a point cloud, DBSCAN creates a window at each point and

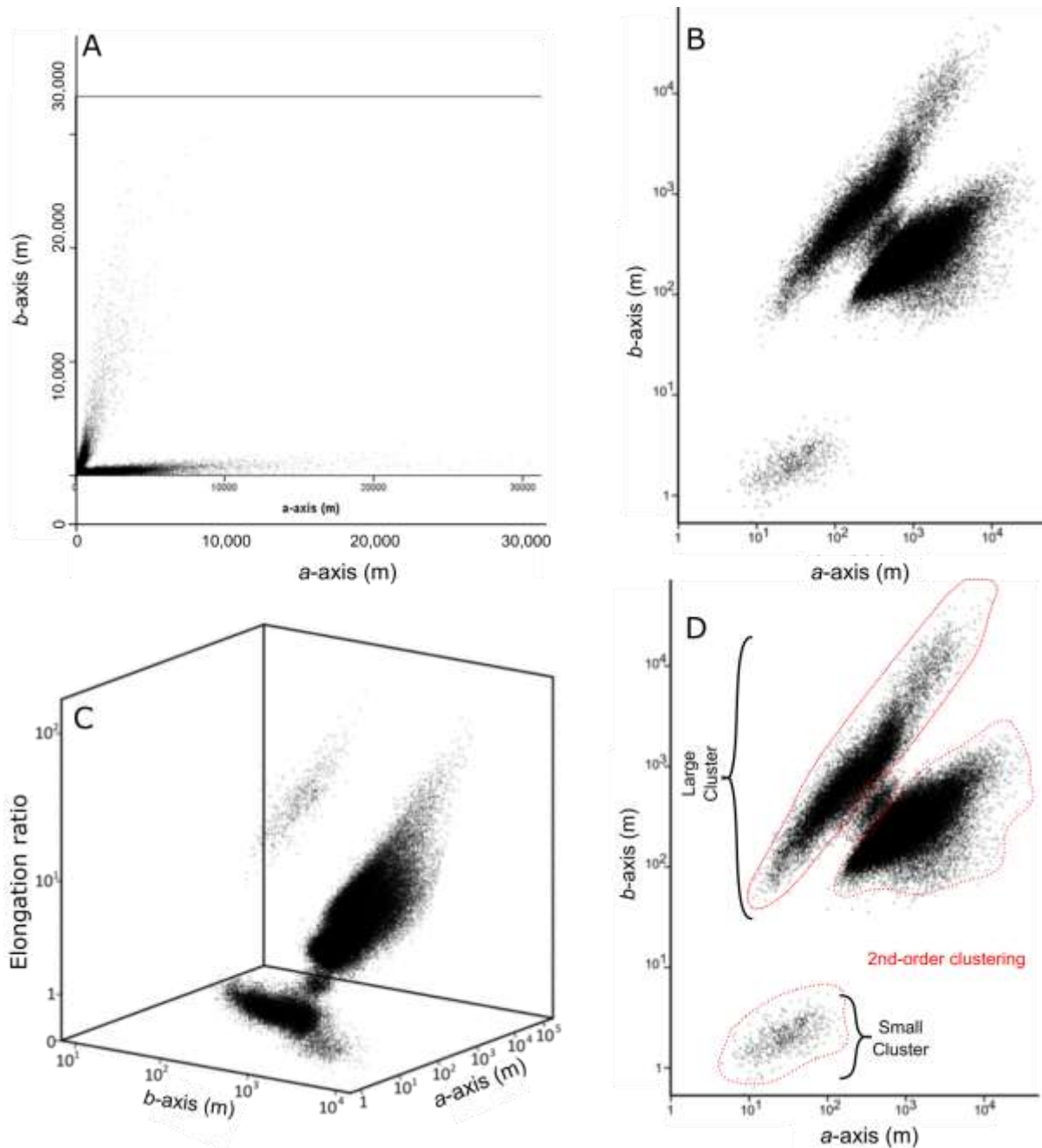
175 determines which points are sufficiently reachable from each other in order to warrant
176 definition as a cluster (Ester et al., 1996). Core points are deemed reachable if there are more
177 than *MinPts* within the search radius of \mathcal{E} from that point, and are included within the cluster
178 owing to point density. Additionally, points are also deemed cohesive with the cluster if a
179 core point is within the radius of \mathcal{E} . If neither of these criteria are met, the point is deemed to
180 be outside of the cluster or is left unclustered. Sensitivity analysis of cluster-definition to
181 window size (\mathcal{E}) was run from $\mathcal{E} = 1.0$ to $\mathcal{E} = 0.01$ with steps of $\mathcal{E} = 0.01$. The sensitivity of
182 minimum points per cluster (*MinPts*) was also tested at values of 10, 50, and 100. The
183 DBSCAN procedure was only conducted on the independent variables of length and width,
184 elongation being derived from the two.

185 A second approach based on a direct, visual assessment of the degree of overlap
186 between assigned bedform category metrics was also applied (Table 1). In covariance plots of
187 the measured variables (e.g., length vs. width), the density of observations per category were
188 calculated and contoured. Here, the highest density contour contained 75% of the
189 observations, the middle 95%, and the lowest 99%. The degree of overlap between adjacent
190 categories was then evaluated in order to test the validity of frequently used bedform
191 nomenclature.

192 **3. Results**

193 The size and shape of all 96,900 subglacial bedforms in our data set is displayed in Fig.
194 5. The most striking aspect is that data are concentrated into a narrow range of values. When
195 plotted on linear axes (Fig. 5A), there appears to be two clouds of data which merge toward
196 the origin of the plot. Larger bedforms ($>10,000$ m) are less frequent in our data set, but plot
197 as extensions of the same data clouds rather than forming separate clusters. Due to the skew
198 imposed by these large values, data was also plotted on a logarithmic scale (Figs. 5B-D). At

199 first order, two clusters of data are visually discernible: a small cloud of narrow and elongate
200 bedforms aligned with flow direction, and a much larger cloud comprising the remaining
201 bedforms (Fig. 5D). Within this larger cloud, density variations occur, perhaps recording
202 three populations that (in places) merge and overlap, or maybe this is a single cluster that has
203 been incompletely sampled. Within the larger cloud, these subclusters exhibit ellipsoid
204 scatters with apparent trends (red ellipses in Fig. 5D), with bedforms with a larger a -axis than
205 b -axis following a separate trajectory to transverse bedforms. Bedforms with no clear
206 orientation (i.e., circular) fall between these two groups.



208

209 Fig. 5. The size and shape of all 96,900 subglacial bedforms, paying no regard to their nomenclature.
 210 (A) Plot of *a*-axis (down-flow) and *b*-axis (across flow) dimensions. (B) The same dimensions, plotted
 211 on log-log axes. (C) Combined plot of *a*-axis, *b*-axis and elongation ratio (*a*/*b*). Although elongation
 212 ratio is dependent upon *a* and *b* axes, it is plotted for visualisation purposes. (D) Two possible
 213 qualitative (visual) interpretations of clusters. Perhaps the data reveals just two clusters, or on closer
 214 inspection it might be possible to distinguish four. See text for further details.

215 To assess the degree to which separate populations are quantitatively distinctive, the
216 density-based clustering algorithm (DBSCAN) was used with an extensive sensitivity
217 analysis (results are summarised in Fig. 6). At the extremes of the window size parameter
218 (\mathcal{E}), the algorithm groups the data into inappropriately sized clusters. When \mathcal{E} is large, the
219 window size is such that the whole data set is seen as a single cluster (Fig. 5A). When \mathcal{E} is
220 small, either numerous small clusters or no clusters at all are detected because of an
221 insufficient search radius (Fig. 6O). The most common result is that two clusters are detected
222 (Figs. 6B-F, K, L, and N). These two clusters occur in the same positions as the first-order
223 visual clustering (Fig. 5D). The larger cluster is not separated when the search window size
224 parameter is adjusted from 0.5 to 0.06 (Figs. 6H-J). Beyond this, the larger cloud is separated
225 into two clusters, one with bedforms aligned with flow direction and another with bedforms
226 transverse to flow (Figs. 6K-N). For only a very small parameter space, DBSCAN
227 distinguishes subglacial bedforms with no clear orientation with flow direction from flow-
228 aligned and flow-transverse bedforms (Fig. 6M). Our results were found to be insensitive to
229 the minimum number of points parameter (*MinPts*).

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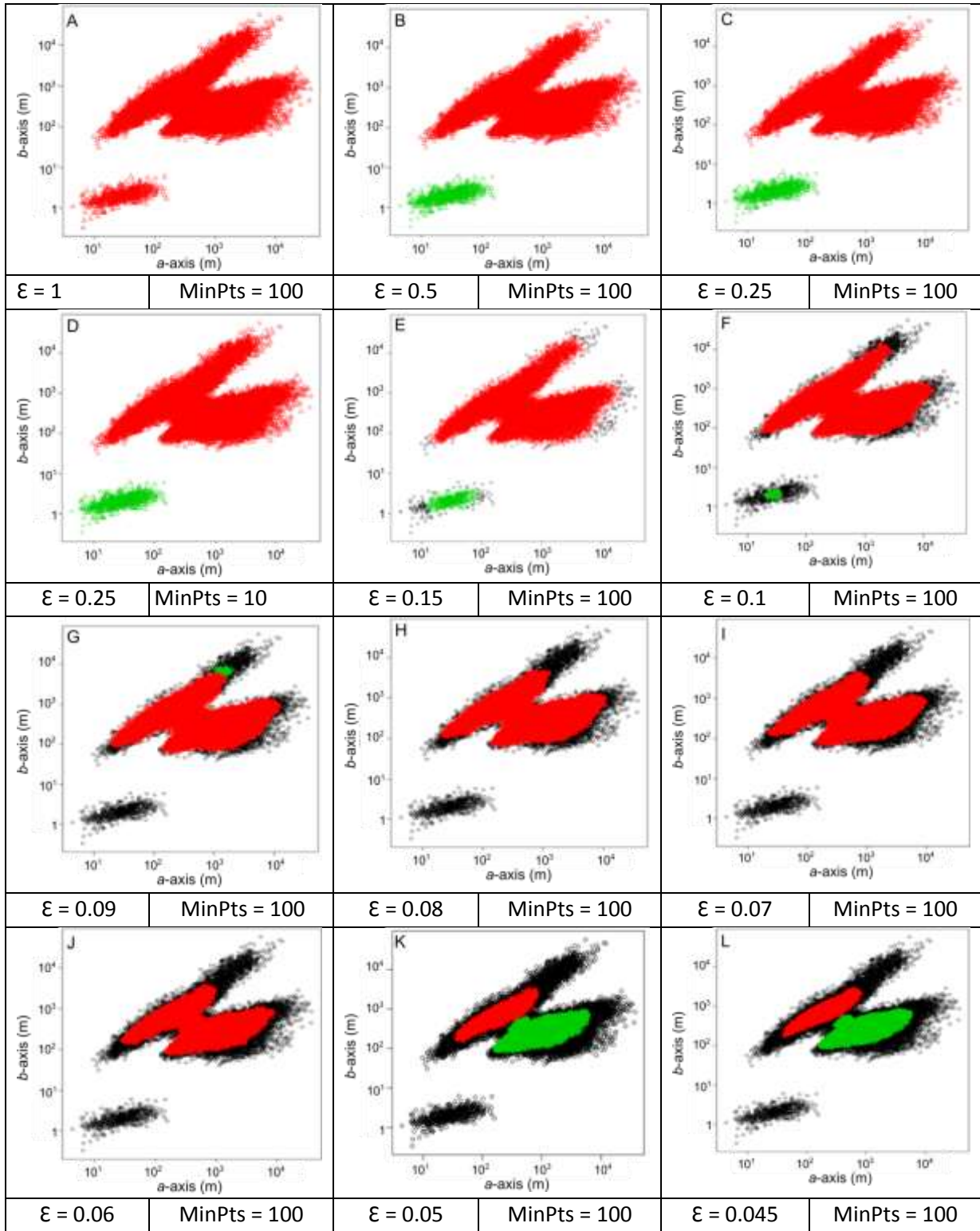
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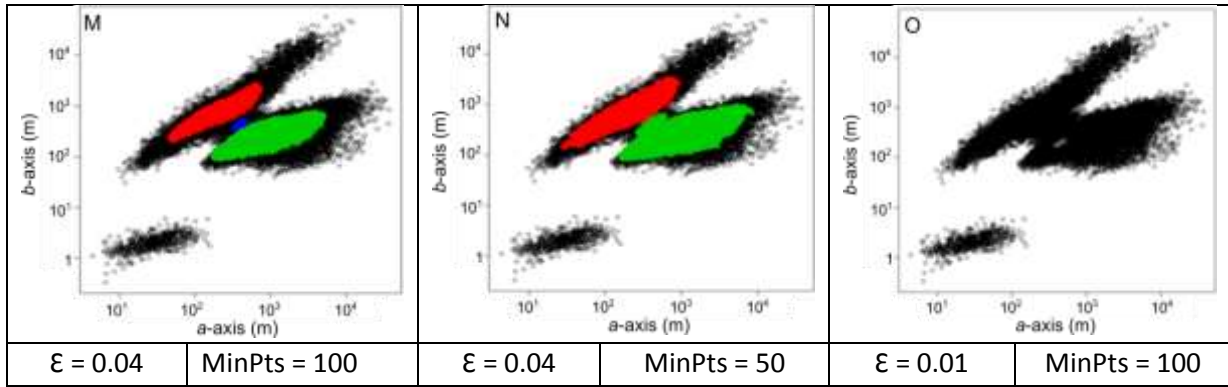


Fig. 6. DBSCAN sensitivity analysis to assess how many clusters exist using different parameter

settings. Red, green, and blue indicate different clusters. Black points are disregarded by the clustering algorithm as being outside of any cluster caused by a lack of density and cohesiveness with other points. The most common result is that two clusters are detected (B, C, D, E, and F): narrow elongate bedforms and a larger cluster comprising of the remaining data. This occurs when $\mathcal{E} = 0.5 - 0.1$, and *MinPts* = 10-100 (B-F). For $\mathcal{E} = 0.09 - 0.06$ (G-J), the smaller cluster is not detected, but the large cluster remains. When $\mathcal{E} = 0.05-0.045$, clusters distinguish between flow alignment (K). At $\mathcal{E} = 0.04$ and *MinPts* = 100, a further small cluster between flow alignments is detected (blue in 'M'). Yet, a slight change in parameter values alters this result (N). When \mathcal{E} is too large, the whole data set is considered a cluster (A), or when \mathcal{E} is too small, no clusters or clusters of an inappropriate size are detected (O).

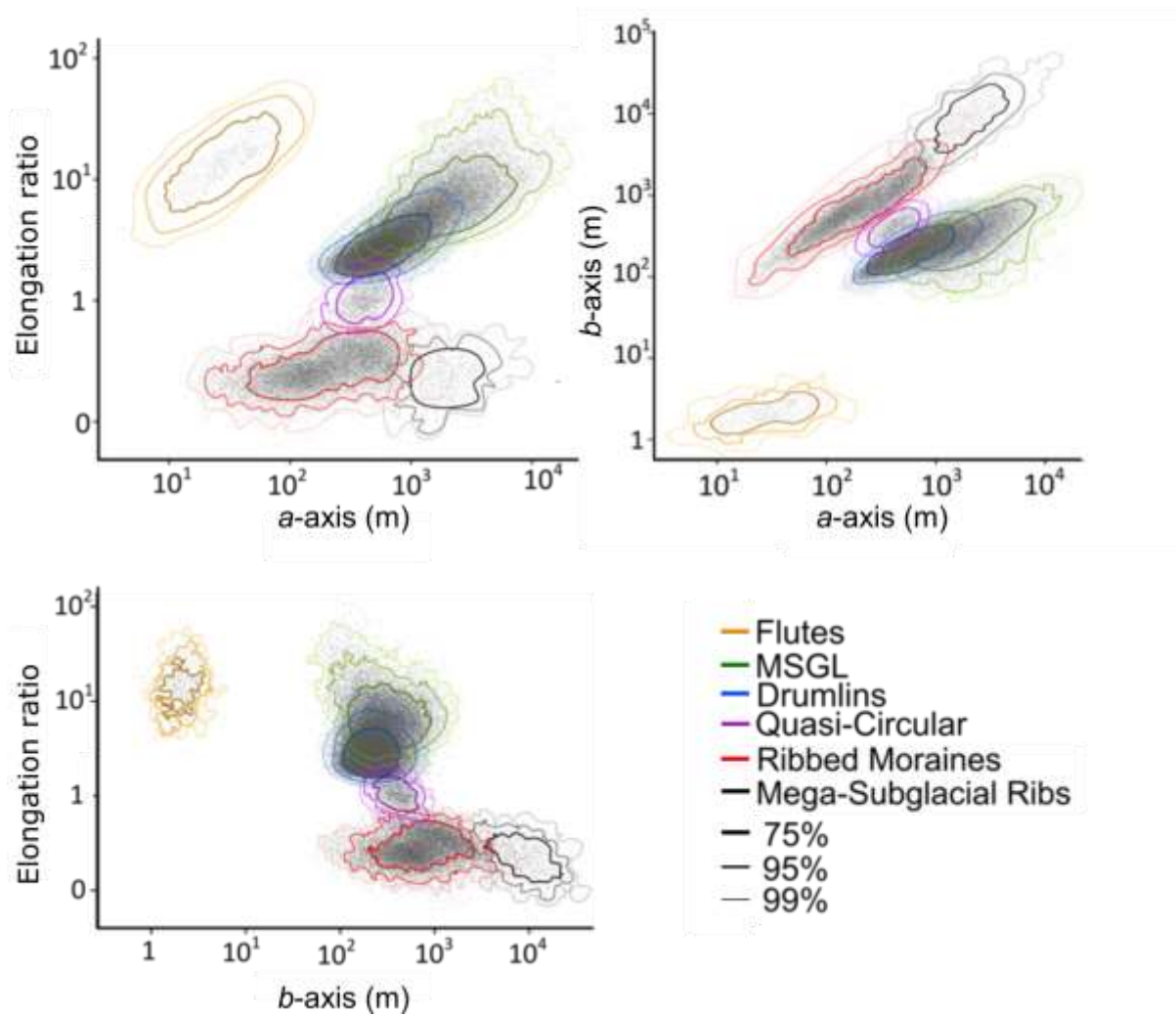
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237 When each bedform's previously determined category was considered, the group of
 238 small bedforms that were distinguished visually (Fig. 5) and by DBSCAN (Figs. 6B-F), are
 239 revealed to be those that are commonly known as flutes (Figs. 7 and 8). The distinguishing
 240 factor of flutes is their *b*-axis, which is much smaller than for all other subglacial bedforms
 241 (Fig. 7), and has a narrow range and small measures of variance (Table 3). Overlap occurs
 242 between all other categories of bedform, as shown by the intersection of density contours
 243 belonging to adjacent categories (Fig. 7) and the frequency distribution of their measured
 244 metrics (Fig. 8). The strongest overlap occurs between drumlins and MSGSLs, which for all
 245 parameter combinations occurs between 75% contours. The median *b*-axis, and the 10th and
 246 90th percentiles of the drumlin and MSGSL categories are remarkably similar (Table 3),

247 indicating a consistency between the two groups. This contributes to the clustering of
248 drumlins and MSGL together, visually and in DBSCAN (Figs. 5 and 6). The elongation ratio
249 of ribbed moraines and megaribs is also similar, with low coefficients of variation (Table 3).
250 This indicates a similar shape. The size range of quasi-circular bedforms is much narrower
251 compared to all other subglacial bedforms, except for flutes. Additionally, the coefficient of
252 variation for their size metrics is small, hence their selective positioning on Fig. 5. The
253 category of quasi-circular bedforms may contain bedforms some might categorise as either
254 drumlins or ribbed moraines. However, the mean elongation ratio of 1.07 (Table 3) and the
255 high density of data on Figs. 5, 6, 7, and 8 where the elongation ratio is 1 clearly indicates the
256 existence of near-circular forms.

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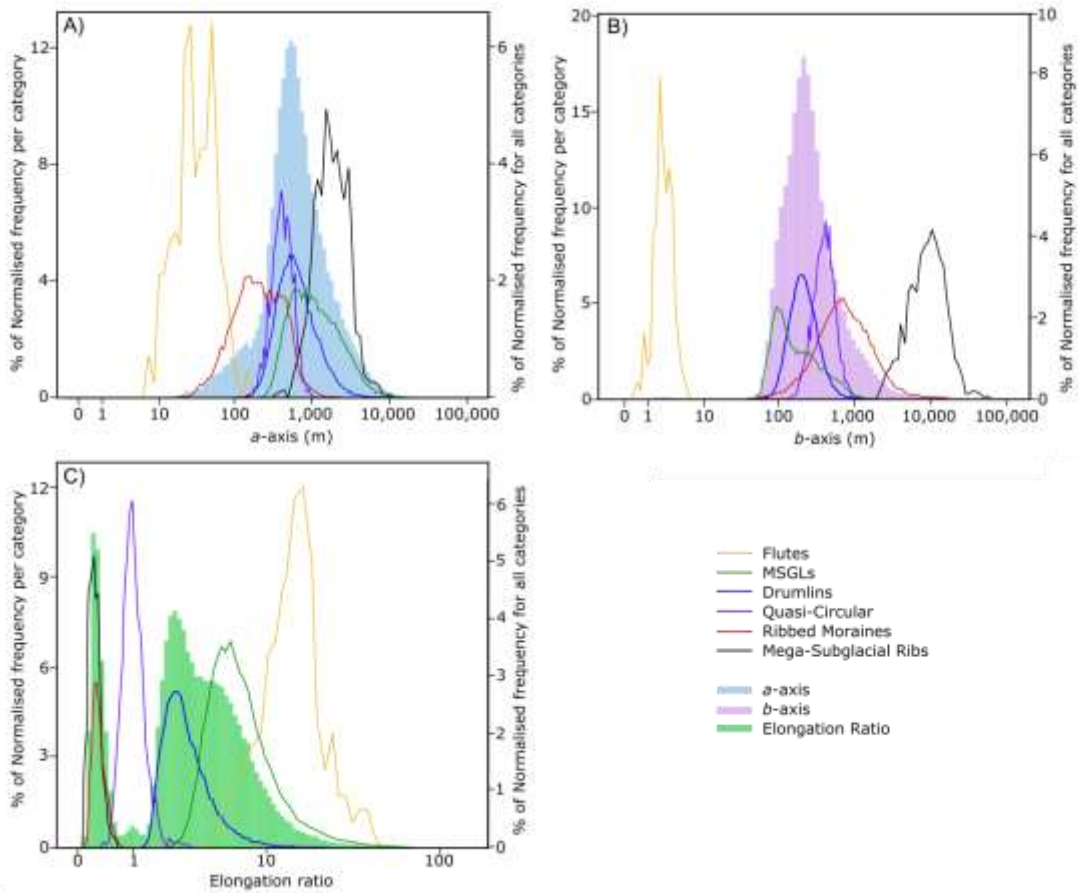
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260 Fig. 7. Density contour plots to assess the degree of separation and overlap between named bedform
 261 types. Flutes consistently plot separately to all other bedform types, whilst overlap (*a*-axis, *b*-axis plot)
 262 occurs between other subglacial bedform types. Most notably, this overlap occurs between drumlins
 263 and MSGL (overlapping 75% contours) and between ribbed moraine and megasubglacial ribs
 264 (overlapping 90% contours). Quasi-circular bedforms overlap with ribbed moraine (90% contours) and
 265 drumlin (75%) contours. Note that elongation ratio is derived from length and width. However, it is
 266 plotted against its components here for illustrative purposes.

267



268

269 Fig. 8. Frequency distributions for (A) *a*-axis, (B) *b*-axis, and (C) elongation ratio. In each case, the
 270 probability distribution function of each bedform is plotted, normalised to the total population of their
 271 respective category in order to permit comparisons. This is plotted on the primary y-axis. The
 272 histograms (in solid colours) show the distribution of the whole population, plotted against the
 273 secondary y-axis.

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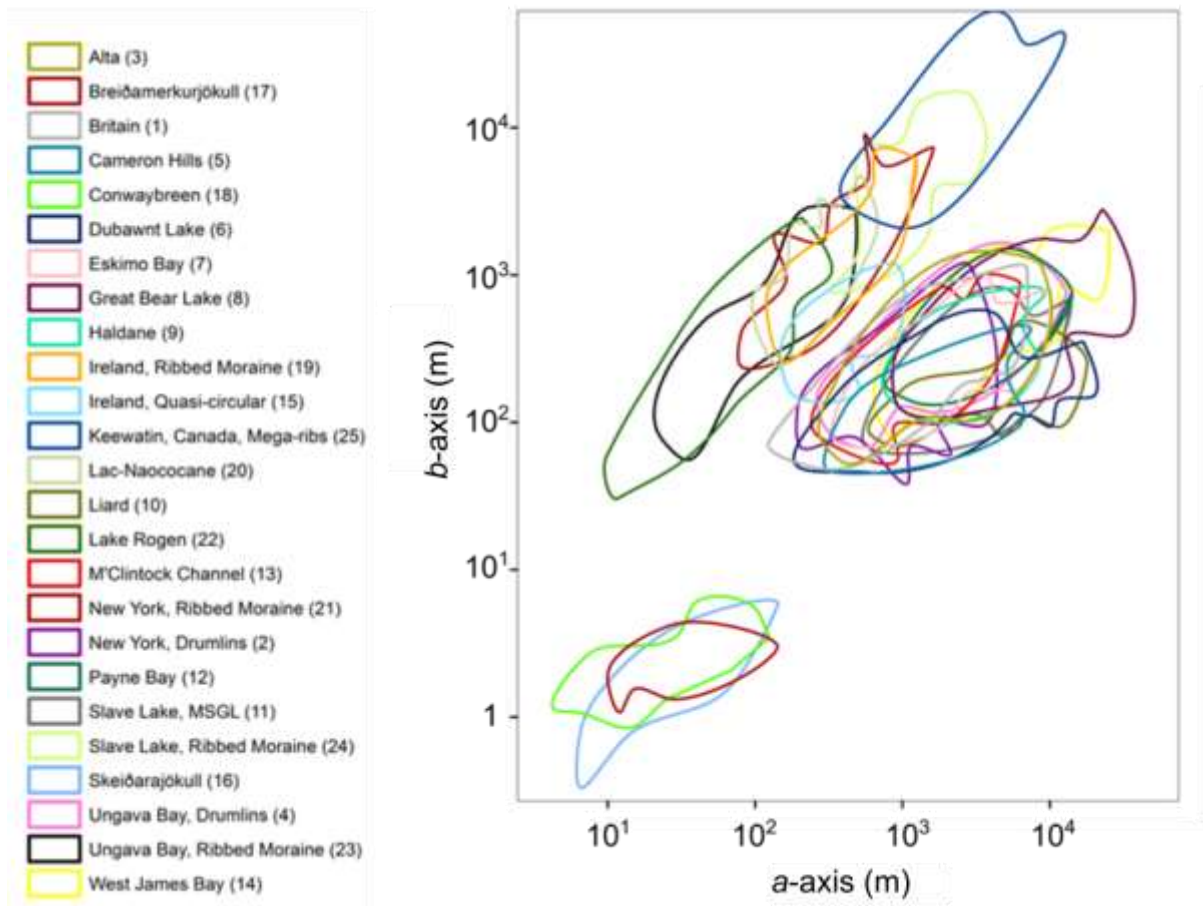
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283 **Table 3.** Summary statistics of subglacial bedform categories

		Range (m)	Median (m)	10th Percentile (m)	90th Percentile (m)	Coefficient of Variation
Flutes	<i>a-axis</i>	138.1	30.5	12.9	68.4	0.6
	<i>b-axis</i>	5.6	2.1	1.3	3.4	0.4
	<i>Elongation</i>	41.0	15.3	7.9	25.2	0.4
Megasubglacial ribs	<i>a-axis</i>	11765.4	1980.4	1094.6	3706.4	0.6
	<i>b-axis</i>	53940.1	9286.3	4283.4	17692.7	0.6
	<i>Elongation</i>	0.55	0.2	0.1	0.4	0.4
Ribbed Moraines	<i>a-axis</i>	3683.6	196.9	61.2	606.5	0.9
	<i>b-axis</i>	16749.8	701.1	260.1	1941.8	1.0
	<i>Elongation</i>	0.75	0.27	0.2	0.4	0.4
Circular Bedform	<i>a-axis</i>	876.4	416.9	274.6	615.0	0.3
	<i>b-axis</i>	1002.7	409.2	264.3	596.6	0.3
	<i>Elongation</i>	2.64	1.0	0.7	1.4	0.3
Drumlins	<i>a-axis</i>	10602.1	603.5	323.4	1372.6	0.7
	<i>b-axis</i>	1509.7	213.6	131.2	371.7	0.5
	<i>Elongation</i>	36.20	2.8	1.9	4.9	0.5
MSGLs	<i>a-axis</i>	37268.2	1102.1	427.4	3912.9	1.2
	<i>b-axis</i>	2725.8	150.1	81.7	479.2	0.9
	<i>Elongation</i>	131.62	6.4	4.0	12.9	0.8

284

285 To assess if there are any systematic controls on bedform metrics from their geographic
 286 location, Fig. 9 plots the outlines of the data at each locality shown in Table 1. No single
 287 location plots separately to the others, with all locations showing multiple overlap with other
 288 areas.



289

290 Fig. 9. Outlines of the length and width of bedform scatter plots grouped by location. Locations are
 291 listed in Table 1. Note the overlap between locations, such that data from no single location is found
 292 to be unique.

293

294 4. Discussion

295 *4.1. Is there a subglacial bedform size and shape continuum, several continua, or*
 296 *are they separate phenomena?*

297 The number of populations or clusters, and therefore the number of continua, within our
 298 data set depends, to some extent, upon the interpretation of Figs. 5, 7, and 8, as well as the
 299 parameters chosen for DBSCAN (Fig. 6). However, a consistent result is that flutes plot
 300 separately to all other subglacial bedforms (Figs. 5-9), forming a distinct population. Given

301 their smaller size, flutes could only be mapped from aerial photography (Tables 1 and 2),
302 rather than digital terrain models or satellite images, but we do not interpret their separation
303 to be a consequence of higher resolution imagery being used for mapping. This interpretation
304 is supported by observations of flutes that reach over 1.5 km long (exceeding the length of
305 many drumlins) whilst maintaining their narrow width (Kjær et al., 2006). Flutes are often
306 found superimposed on top of drumlins (e.g., Boulton, 1987; Hart, 1995; Waller et al., 2008),
307 emphasising the scale difference between the two. We therefore interpret flutes to be
308 morphologically distinct to all other subglacial bedforms, forming a group of narrow and
309 elongate subglacial bedforms. Thus, a clear difference exists in scale between flutes and other
310 subglacial bedforms. This is consistent with previous suppositions and interpretations
311 (Boulton, 1976; Rose, 1987; Clark, 1993).

312 Aside from flutes, it is difficult to distinguish separate populations of bedforms that are
313 elongated with ice-flow direction. A consistency in *b*-axis lengths and a lack of any stepwise
314 jump in *a*-axis lengths between drumlins and MSGsLs means that these two categories of
315 flow-aligned bedforms were never separated by any combination of parameters in our
316 quantitative analysis (Fig. 6). They display the highest level of overlap on Figs. 7 and 8. We
317 therefore concur with previous work using a smaller data set (Stokes et al., 2013b) that
318 drumlins and MSGL form a size and shape continuum of subglacial lineations.

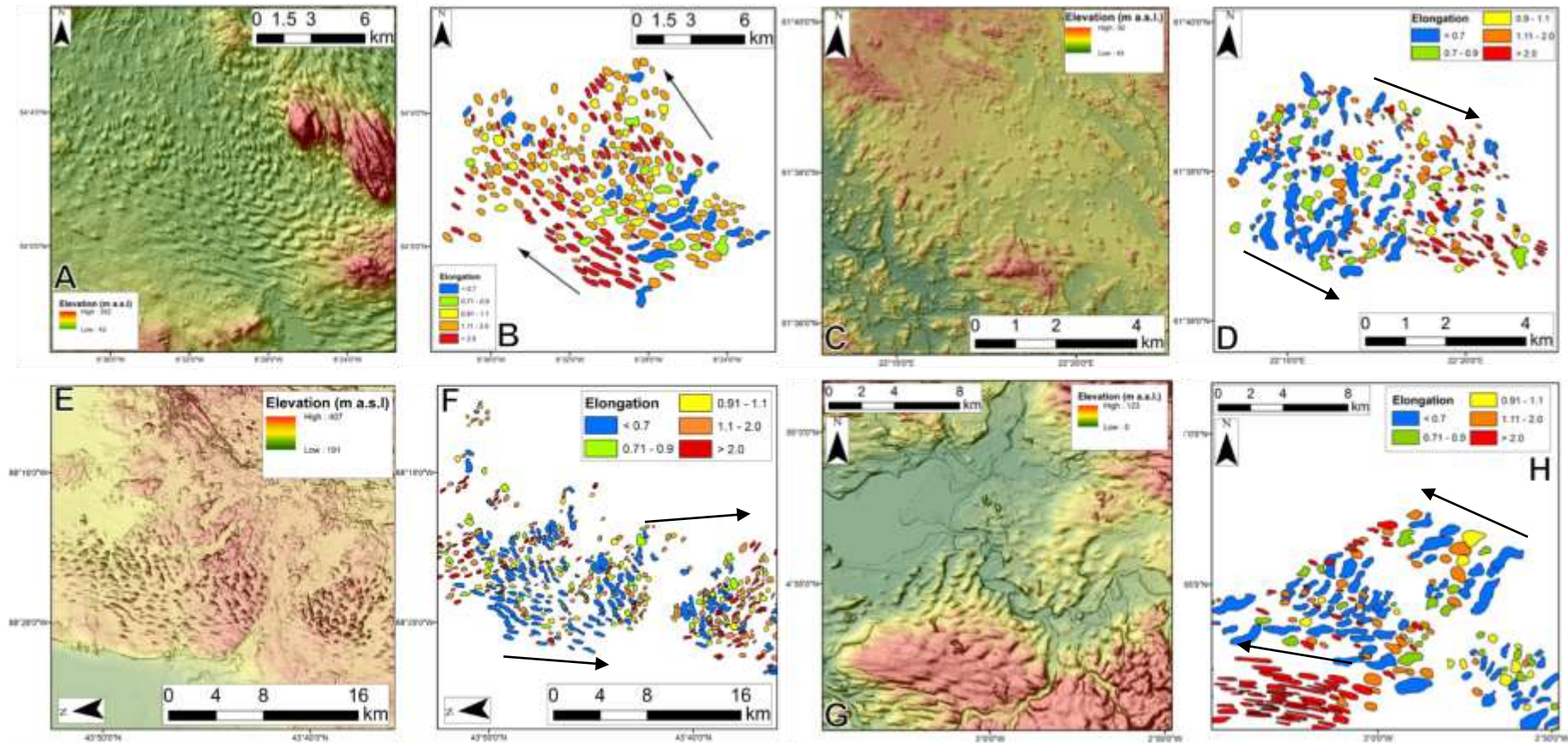
319 Ribbed moraines and megascale ribs also possess overlapping size and shape metrics
320 (Figs. 7 and 8), and were only partially separated by one combination of DBSCAN
321 parameters (Fig. 6G), which may be a consequence of a smaller sample of mega-ribbed
322 moraines. Both populations have a consistent elongation ratio of ≈ 0.3 (Table 3). We find no
323 grounds to suggest different morphological populations of ribbed moraines, as suggested
324 elsewhere (e.g., Hättestrand, 1997), as there is no clear break or stepwise relationship in the
325 metrics to indicate separate size and shape categories. Furthermore, putatively different types

326 and scales of subglacial ribs often display close spatial relationships (Greenwood and
327 Kleman, 2010), and have been observed to occur in potentially evolutionary sequences
328 (Markgren and Lassila, 1980). Therefore, we propose that ribbed moraines and mega-ribs
329 form a size and shape continuum of transverse subglacial bedforms that can be called
330 subglacial ribs.

331 The existence of quasi-circular bedforms that overlap with drumlins and ribbed
332 moraines (Figs. 5, 7, and 8) raises the possibility of a single bedform continuum comprising
333 ribs to quasi-circular forms to lineations (e.g., Aario, 1977). All three are often categorised as
334 one cluster by DBSCAN (Figs. 6B-J). When they are split into separate clusters by the
335 quantitative analyses (Figs. 6K-N) it may be a consequence of a genuine difference in the
336 shape and scale of subglacial ribs and lineations (Fig. 5D) and/or a small sample size of
337 quasi-circular forms (Table 1). The bridging between ribbed moraines and drumlins provided
338 by quasi-circular bedforms only occurs within a narrow range of *a*- and *b*-axis lengths,
339 centred around 450 m (Figs. 5 and 8).

340 Quasi-circular bedforms — such as the Blattnick moraine of Markgren and Lassila
341 (1980), the mammillary hills of Aario (1977), the circular forms noted by Knight et al.
342 (1999), and the ovoid forms noted by Smith and Wise (2007) — are often reported in
343 transition zones between ribbed moraines and drumlins. Quasi-circular forms were most
344 notable in several locations across the bed of the Irish-ice sheet (Greenwood and Clark,
345 2008). Given their potential importance, further examples of quasi-circular bedforms were
346 sought and are shown in Fig. 10. These examples illustrate how they occur in gradual down-
347 ice transitions between subglacial ribs and lineations and sometimes superimposed upon
348 subglacial ribs. Since subglacial bedforms are often assigned a label based upon flow
349 orientation, perhaps quasi-circular forms have been confusing to identify and classify and are

350 more common than is reported in the literature. As they may form an important link between
351 subglacial ribs and lineations, further work on quasi-circular bedforms is required.



354 Fig. 10. Examples of spatial transitions between ribbed moraines and drumlins. Note how in each case, bedforms with no clear alignment to flow (elongation
 355 ratio of 0.9 to 1.1; yellow) were noted. (A) Hill-shaded SRTM DEM (30 m) and mapping (B) of bedforms in County Roscommon, Ireland. (C) 2 m LiDAR-
 356 derived DEM and mapping (D) of bedforms near Harjavalta, Finland. (E) Hill-shaded 2 m LiDAR DEM and mapping (F) of bedforms in Fon Du Lac County,
 357 Wisconsin, USA. (G) Hill-shaded NEXTMAP (5 m) DEM and mapping of bedforms (H) in Cumbria, UK.

358 *4.2. Controls on the size and shape of subglacial bedforms*

359 A correspondence between bedform size and shape and the flow characteristics of the
360 geomorphic agent is often invoked for aeolian, fluvial, and marine bedforms (Allen, 1968;
361 Rubin and Ikeda, 1990; Reffet et al., 2010). Similar links have been sought for subglacial
362 bedforms (e.g., Rose and Letzer, 1977). Several lines of evidence that suggest that subglacial
363 bedform size and shape is primarily determined by properties of the overlying ice mass.
364 Firstly, bedforms within a flowset usually have a similar size, shape, and alignment to flow
365 direction (Clark, 1999). Thus, different flow events, with different glaciological properties,
366 produce different bedform morphologies. Secondly, bedforms are often observed to evolve
367 gradually along former ice flow trajectories. Such evolutionary sequences can take the form
368 of increases in the elongation of lineations (e.g., Ó Cofaigh et al., 2002; Stokes and Clark,
369 2002; Briner, 2007; Stokes et al., 2013b) or a switch from ribs to drumlins (e.g., Fig. 8;
370 Aario, 1977; Aylsworth and Shilts, 1989; Dyke et al., 1992; Knight et al., 1999; Dunlop and
371 Clark, 2006b). Both of these situations have been interpreted to indicate ice acceleration
372 along flow, particularly in ice-stream settings (Aario, 1977; Hart, 1999; Ó Cofaigh et al.,
373 2002; Stokes and Clark, 2002; Briner, 2007; Stokes et al., 2013a). Support for this is found
374 from modern ice streams where drumlins have been observed beneath the onset zone of
375 Rutford Ice Stream (King et al., 2007) and MSGLs farther down-flow where ice velocity is
376 higher (King et al., 2009). Subglacial ribs can also be found in evolutionary sequences
377 (Markgren and Lassila, 1980; Greenwood and Kleman, 2010), suggesting a gradual change in
378 boundary conditions, potentially induced by ice-flow properties. Thirdly, bedform
379 morphology conforms strongly to glaciological variables at the ice-sheet scale (Greenwood
380 and Clark, 2010). At the local scale, lithological, sedimentological, and topographical
381 differences across a bedform field may correspond to morphological differences in the
382 bedforms/landforms (e.g., Raukas and Tavast, 1994; Rattas and Piotrowski, 2003;

383 Greenwood and Clark, 2010). As deformable sediment can accommodate accelerated ice
384 flow (Alley et al., 1986), the glaciological and sedimentological properties of an ice mass can
385 be interlinked. For example, where there is a boundary between a hard bedrock and soft
386 deformable sediment, there is often a corresponding increase in bedform elongation,
387 interpreted to correspond to an acceleration in ice flow (e.g., Wellner et al., 2001; Ó Cofaigh
388 et al., 2002). Therefore, given the complex interaction between ice flow and the nature of its
389 underlying substrate, the exact influence of each of these two components can be rarely
390 discerned.

391 The most commonly invoked glaciological control on subglacial bedform morphology
392 is ice velocity. Ribbed moraines typically are found near ice divides or cold-based regions
393 (Hättestrand, 1997; Trommelen et al., 2014) or on ice-stream beds where they have been
394 inferred to record deceleration immediately prior to ice stream shutdown (Stokes et al., 2008).
395 This suggests slower ice flow is associated with their formation, even if the precise
396 mechanisms are unknown. Drumlins are found farther away from ice divides and in the onset
397 zones of palaeo (Stokes and Clark, 1999; Anderson and Fretwell, 2008) and contemporary ice
398 streams (King et al., 2007), whereas more elongate subglacial lineations (MSGs) have been
399 associated with ice streams (Clark, 1993, 1994; Stokes and Clark, 1999; King et al., 2009;
400 Spagnolo et al., 2014a). Ice velocity seems to be a primary influence upon bedform
401 orientation and elongation within and between ribs and lineations. Flutes have a separate
402 morphology to other subglacial bedforms (Figs. 5-9). Thus, it is likely that they form under a
403 separate set of boundary conditions or by a process different to the larger bedforms.

404 The size and shape variations of subglacial bedforms appear to be predominately
405 explicable in terms of position within the ice sheet and by variations in glaciological
406 properties. In contrast, bedform sedimentary composition is found to be incredibly varied
407 (overview of ribbed moraine in Hättestrand and Kleman, 1999; drumlins reviewed in Stokes

408 et al., 2011, see references therein) and no simple match has been found between sediment
409 properties and the variously named types. Sediment within bedforms can contain evidence
410 of deposition (e.g., Dardis et al., 1984; Fisher and Shaw, 1992; Newman and Mickelson,
411 1994; Möller, 2010; Spagnolo et al., 2014b; Hopkins et al., 2016) and erosion (e.g., Boyce
412 and Eyles, 1991; Kerr and Eyles, 2007; Ó Cofaigh et al., 2013), as well as several phases of
413 development (Newman et al., 1990; Zelčs and Dreimanis, 1997). Thus, competing erosional
414 and depositional processes are likely to occur at the ice-bed interface during bedform
415 production (Hart, 1997). The bedform conundrum is that the order and simplicity in size and
416 shape that we observe, and which tends to lead to presumptions of a unifying process to
417 create them, clashes with the complexity and variation found in the sedimentary properties,
418 which tends to lead to suggestions of a whole range of different processes. We do not solve
419 this problem here, but suggest that our data could be used as a test for any hypothesis or
420 model of bedform formation, noting that the size and shape of bedforms as described here
421 (Figs. 5-9) requires explanation, as does their varied internal structure.

422 **5. Conclusions**

423 To test the hypothesis that subglacial bedforms comprise a size and shape continuum
424 across the variously-named types, we analysed 96,900 measurements of subglacial bedform
425 size and shape. The approach was to assess if bedforms vary continuously in size and shape,
426 and thereby comprise a continuum, or whether gaps or jumps exist between the variously
427 named types, indicating that they should be interpreted as discrete phenomena and therefore
428 leading to the continuum hypothesis being rejected. Qualitative and quantitative (cluster)
429 analyses of the data were employed to assess the degree to which separate populations exist.
430 Although there is inherent subjectivity in any type of cluster analysis, be it visual or
431 quantitative, the convergence of results from our analyses leads us to the following
432 conclusions:

- 433 • Subglacial flutes form a distinct cluster of narrower subglacial bedforms, clearly
434 separable from other bedforms.
- 435 • Drumlins and MSGL are end members of a size and shape continuum of flow-aligned
436 subglacial bedforms (subglacial lineations).
- 437 • Transverse subglacial bedforms belong to a subglacial rib continuum that spans ribbed
438 moraine through to mega-ribbed moraine, with no justification found here for separate
439 entities existing within this class.
- 440 • An underreported class of bedforms that are quasi-circular potentially bridge the more
441 obvious continua of lineations and ribs suggesting that a single subglacial continuum
442 spanning ribs, quasi-circular forms, and lineations might exist. To test this possibility,
443 further work on quasi-circular forms is required to increase the sample size and
444 examine the range of scales at which they exist.

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