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1 **Seismic clustering in the Sea of Marmara: Implications for monitoring**
2 **earthquake processes**

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30 **1. Introduction**

31 Laboratory rock deformation experiments show typically foreshocks and other signals
32 associated with preparation of large events (e.g. Goebel et al., 2013; Selvadurai et al., 2017; Renard
33 et al., 2018). Foreshock activity has been observed before some large earthquakes such as the
34 August 1999 Mw 7.4 Izmit earthquake along the North Anatolian fault (e.g. Bouchon et al., 2011;
35 Ellsworth & Bulut, 2018). However, other large events including the November 1999 Mw 7.1
36 Düzce earthquake to the east of the Izmit event were not preceded by clear foreshocks (e.g. Wu et
37 al., 2014). Analysis of pre-shock activity along the North Anatolian fault and other major faults
38 has not been done systematically, in part because of the lack of high quality seismic catalogs.
39 Refined hypocenter catalogues offering improved spatial resolution and lower magnitude of
40 completeness allow for detailed studies of foreshocks. This is of particular importance for fault
41 segments near densely populated regions, such as the Marmara section of the North Anatolian Fault
42 Zone in Turkey, that are late in their seismic cycle. Below the eastern Sea of Marmara close to the
43 Istanbul metropolitan region, several foreshocks have recently been observed preceding a Mw 4.4
44 event (Malin et al., 2018).

45 Earthquake cluster identification is essential for understanding the dynamics of seismicity.
46 Systematic analysis of earthquake clusters in a region can provide a context for local variations of
47 foreshocks and other informative patterns of seismicity. The number and structure of earthquake
48 clusters can vary in space and time on a range of scales (e.g., Ben-Zion, 2008; Zaliapin & Ben-
49 Zion, 2016a). Analytical and numerical results in a viscoelastic damage rheology models suggest
50 that basic properties of earthquake clustering are controlled by the effective viscosity of the
51 deforming medium (Ben-Zion & Lyakhovsky, 2006). This implies that heat flow and the presence

52 of fluids should play an important role in determining key properties of earthquake clustering
53 (Zaliapin & Ben-Zion, 2013b).

54 Repeating earthquakes representing overlapping rupture areas and similar earthquake
55 magnitudes are also important for quantifying regional seismic hazard, and are seen as indicators
56 for fault creep. Observations of repeating earthquakes along the Western High and Central Basin
57 of the Sea of Marmara suggested that aseismic slip may occur at these locations (Schmittbuhl et
58 al., 2016a; Bohnhoff et al., 2017). Earthquake repeaters are commonly identified by employing
59 waveform cross-correlation to find highly similar seismic waveforms (e.g., .g. Poupinet et al., 1984;
60 Nadeau & McEvelly, 2004; Peng and Ben-Zion, 2005). Recently, using analysis of earthquake
61 clusters, it was found that fluid induced seismicity tends to display an unusually high concentration
62 of events characterized by a relatively short distance and long time to the events initiating the
63 clusters (Schoenball et al., 2015; Zaliapin & Ben-Zion, 2016b). Such events share some key
64 features with the classical earthquake repeaters; however, the precise relation between these two
65 types of events requires further exploration.

66 In this study we utilize a recently derived high-resolution seismicity catalog (Wollin et al.,
67 2018) and nearest-neighbor cluster identification and classification techniques (Zaliapin & Ben-
68 Zion, 2013a, 2013b) to analyze clusters of seismicity in the Sea of Marmara region of the North
69 Anatolian Fault, Turkey. Our main goals are to (1) estimate the spatial distribution of mainshock
70 and aftershock rates and use it to infer the proximity to failure on different fault segments, (2) test
71 the potential of the nearest-neighbor cluster approach to identify areas with enhanced occurrence
72 of earthquake repeaters, and (3) characterize areas with enhanced foreshock activity. In the next
73 section we describe the state-of-the-art knowledge on the seismotectonics and crustal properties of
74 the analyzed fault segments in the Sea of Marmara. The examined seismicity catalogs, the nearest-

75 neighbor methodology and the statistical approach employed are described in Section 3. The main
76 results of the analysis that concerns the spatial distribution of clusters and the relative proportions
77 of foreshocks, mainshocks, and aftershocks are described in Section 4. The implications of the
78 results are discussed in the final Section 5.

79 **2. Fault Segmentation in the Sea of Marmara region**

80 The North Anatolian Fault Zone (NAFZ) is a major dextral strike-slip plate-boundary that spans
81 more than 1200 km across the northern boundary of the Anatolian Plate from east to west (Barka,
82 1992; Sengör, 2005; Bohnhoff et al., 2016). The eastern and central portions of the NAFZ are
83 composed of a single well-developed fault. In the west the NAFZ splits into at least two or three
84 main branches forming a horse-tail structure.

85 The Marmara section is the only portion of the NAFZ that was not activated in a $M > 7$
86 earthquake during the 20th century and thus constitutes a major seismic gap (Bohnhoff et al., 2013).
87 Given the average recurring interval on the order of 250 years and its last activation in 1766 it is
88 considered late in its seismic cycle with high probability to generate a major earthquake in the next
89 decades (Parsons, 2004; Murru et al., 2016). In this region, the pure strike-slip system observed
90 along most of the NAFZ is gradually converted into a transtensional setting due to the rollback of
91 the Hellenic subduction zone superposing a NS-extensional stress field on top of the dextral strike-
92 slip system (e.g. Flerit et al., 2004; Le Pichon et al., 2015). The Sea of Marmara hosts two of the
93 major fault branches of the horse-tail structure. The northern branch, here named “Marmara
94 Section” (in accordance with Wollin et al., 2018) runs directly along the Sea of Marmara
95 accommodating the largest deformation rates (e.g. Hergert & Heidbach, 2010; Ergintav et al.,
96 2014). It is composed of several fault segments combined with extensional basins (Armijo et al.,
97 1999; Le Pichon et al., 2015). We focus our analysis on six pronounced seismicity spots in the

98 Marmara region displaying different seismotectonic characteristics. We summarize the main
99 features of these spots below.

100 **2.1 Western Sea of Marmara region**

101 The westernmost analyzed area extends along the Ganos section and the Tekirdag Basin
102 (TB, Fig. 1). The Ganos section represents a well-defined fault segment with a relatively narrow
103 deformation zone. It last ruptured in a M7.4 event in 1912. It is not known how far this earthquake
104 ruptured offshore into the Tekirdag Basin. This Basin currently hosts the largest cumulative
105 moment release of the entire Sea of Marmara region (Schmittbuhl et al., 2016b).

106 Directly to the east of the Tekirdag Basin, there is the Western High and Central Basin
107 (WH, Fig. 1). There, evidence for earthquake repeaters was found, suggesting that the fault is
108 releasing a substantial portion of its accumulated strain aseismically through creep (Schmittbuhl et
109 al., 2016a; Bohnhoff et al., 2017). These observations have recently been evidenced from ocean-
110 bottom geodesy (Yamamoto et al., 2019). In addition to tectonic loading, degassing in the ocean
111 floor from underground hydrocarbon reservoirs has been suggested as additional mechanism
112 driving the seismicity (Géli et al., 2018). According to the fault mapping, the fault zone is broader
113 and composed of several sub segments. However, the seismicity tends to concentrate in a narrower
114 section directly on top of the main mapped fault segment (Wollin et al., 2018). Lastly, the Central
115 High – Kumburgaz Basin is located directly to the east of the Central Basin in the central Sea of
116 Marmara (KB, Fig. 1). Seismicity rates from this region are comparatively lower than immediately
117 to the East. Seafloor acoustic techniques revealed that this segment is currently fully locked (Sakic
118 et al., 2016).

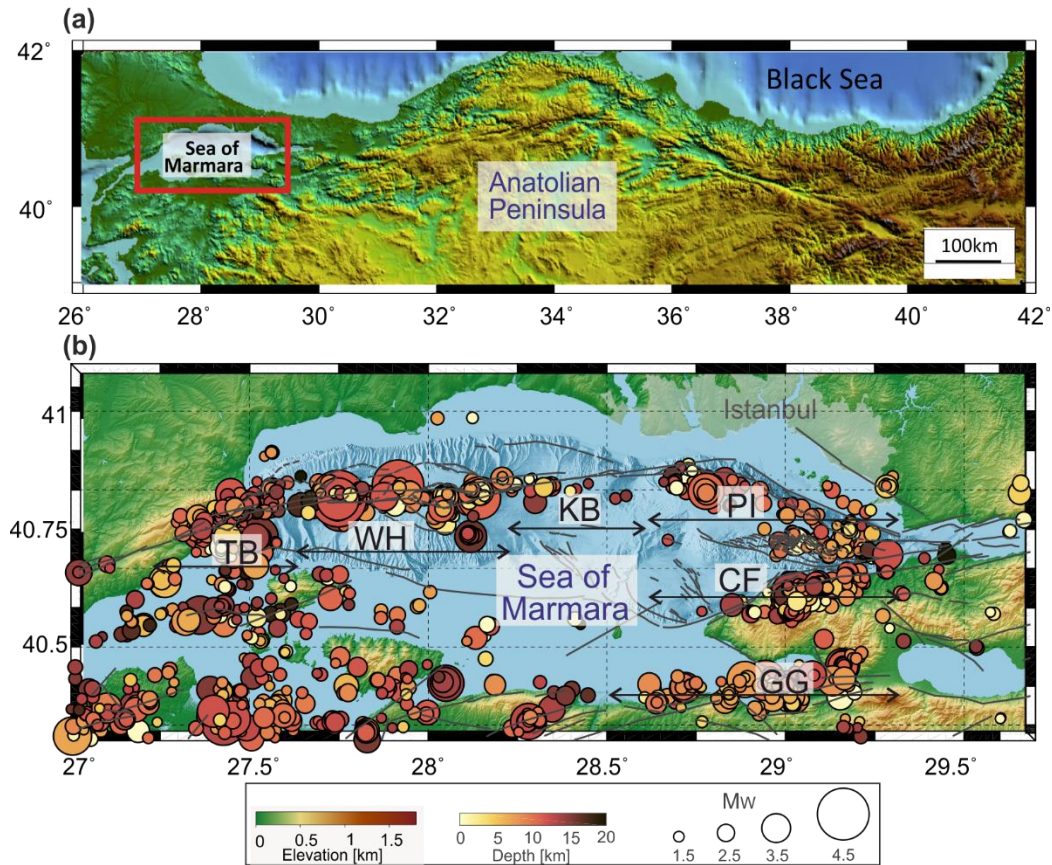
119 **2.2 Eastern Sea of Marmara region**

120 To the east of the Kumburgaz Basin, the Princess Island segment is of special relevance
121 because of its vicinity to the Istanbul metropolitan region (PI, Fig. 1). This fault segment appears
122 currently locked and accumulating strain, as evidenced by a gap in seismicity and lack of fault slip
123 indicated by the GPS observations (Bohnhoff et al., 2013; Ergintav et al., 2014). The
124 microseismicity within this region tends to accumulate on both edges of the fault as well as below
125 10 km depth where the segment tends to merge with the Cinarcik branch of the fault to a single
126 master fault (Bohnhoff et al., 2013). In comparison to the Western High – Central Basin, a
127 substantial portion of the micro-seismicity in this area appears to occur off-fault.

128 The Cinarcik Basin, constitutes a pull-apart structure bounded by the Princess Island
129 segment to the north and the Cinarcik Fault to the south (CF, Fig. 1). The Cinarcik Fault runs
130 approximately parallel to the coast of the Armutlu Peninsula. This fault segment could have hosted
131 the largest earthquake in the Sea of Marmara region recorded in the instrumental era (1963, M 6.3
132 earthquake, Bulut & Aktar, 2007) and it also could represent the western end of the rupture of the
133 1999 M 7.1 Izmit earthquake. The Armutlu Peninsula is a high temperature hydrothermal system
134 which is rich in fluids. It is sensitive to earthquake triggering and some of the most vigorous Izmit
135 aftershocks occurred here (Durand et al., 2010). In 2016, a Mw 4.4 earthquake occurred offshore
136 near the town of Yalova. At least 18 foreshocks were identified during the 40h preceding the
137 rupture (Malin et al., 2018). Following this earthquake, a 50-day lasting strain release was detected,
138 indicating that some of the accommodated tectonic strain could have been released aseismically
139 (Martínez-Garzón et al., 2019).

140 The fault segment in the Gulf of Gemlik is part of the southern fault branch bounding the
141 southern Sea of Marmara shore (GG, Fig. 1). This fault segment is possibly connecting the Izmit

142 Lake section of the NAFZ with the southern Marmara branch towards the Bursa region. The
 143 Gemlik area has generated several $M > 4$ events in the last decade. This fault segment is also
 144 relevant for the seismic hazard as it is in direct vicinity to Bursa city with more than 3 million
 145 inhabitants.



146
 147
 148 **Figure 1.** (a) Regional map framing the studied area (red rectangle) on the western portion of the
 149 North Anatolian Fault Zone. (b) Map of the Sea of Marmara region with epicenter locations from
 150 the Wollin et al., (2018) catalog (for the period January 2006 to March 2016 and with a magnitude
 151 of completeness $M_C^{WOLL} = 2.1$) color encoded with hypocentral depth. The different analyzed are
 152 Tekirdag Basin and Ganos section (TB), Western High – Central Basin (WH), Kumburgaz Basin
 153 (KB), Princess Islands (PI), Cinarcik Fault and Armutlu Peninsula (CF) and Gulf of Gemlik (GG).

154 3. Data selection and Methodology

155 3.1 Earthquake catalog

156 We analyze two seismicity catalogs of different quality containing different number of
157 events. The main seismicity catalog is a ten-year (January 2006 – March 2016) catalog containing
158 the seismicity from the region around the Sea of Marmara (Wollin et al., 2018). The catalog covers
159 the region within 26.5°-30.5°E and 40°-41°N and includes 4,744 relocated events. After removing
160 areas of suspected quarry activities, 3,974 events are identified as earthquakes (Fig. 1, see Wollin
161 et al., 2018 for details on the quarry identification). The median area of the horizontal error ellipse
162 for the relocated events is 2.5 km² and the mean vertical error is 3.8 km. The Mw magnitude range
163 of the events in the catalog is [0 – 4.5]. Using the estimations of Wollin et al., (2018), we examine
164 1,625 events with magnitude above completeness $M \geq M_C^{WOLL} = 2.1$.

165 We additionally use the KOERI seismicity catalog
166 (<http://www.koeri.boun.edu.tr/sismo/2/earthquake-catalog/>, last accessed 01/03/2019) between the
167 years 2000 and 2018 (Fig. S1). The catalog covers the same region and the provided magnitudes
168 are in the range Mw [1, 5.7]. The events are located using the absolute location method Hypoinverse
169 (<https://earthquake.usgs.gov/research/software/#HYPOINVERSE>, last accessed 01/03/2019).
170 Horizontal and vertical uncertainties are not specified for individual events. After removing
171 suspected quarries following Wollin et al., (2018), a total of 12,739 are selected for further analysis.

172 We assume that for the small events in the Sea of Marmara region $M_W \approx M_L$ (Kılıç et al., 2017)
173 and convert all the magnitudes in the catalog to M_W . We utilize the maximum curvature technique
174 and a method based on a goodness-of-fit technique (Woessner & Wiemer, 2005) to estimate the
175 temporal evolution of the magnitude of completeness M_C^{KOER} using a sliding window of 100 events

176 (Fig S2). This results in an estimation of $M_C^{KOER} = 2.1$, representative for the examined time period.

177 Finally, a total of 8,566 earthquakes with $M \geq M_C^{KOER}$ are used.

178 3.2 Earthquake cluster identification

179 In each examined catalog, we identify seismicity clusters according to their space-time-
180 magnitude nearest-neighbor proximity (Zaliapin et al., 2008; Zaliapin & Ben-Zion, 2013a, 2013b).

181 This technique is selected because of its soft parametrization and robustness with respect to
182 incompleteness, event location errors, and parameter values. The proximity η_{ij} of event j to an
183 earlier event i in the space-time and magnitude domain can be defined as (Baiesi & Paczuski, 2004):

$$184 \quad \eta_{ij} = \begin{cases} t_{ij} (r_{ij})^d 10^{-bm_i}, & t_{ij} > 0, \\ \infty, & t_{ij} \leq 0, \end{cases} \quad (1)$$

185 where $t_{ij} = t_j - t_i$ [in years] and r_{ij} [in kilometers] are the temporal and spatial distances between the
186 earthquakes i and j , respectively, d is the fractal dimension of the hypocenter (or epicenter)
187 distribution, b is the b -value of the Gutenberg-Richter relation and m_i is the magnitude of the
188 (earlier) event i . The scalar proximity η_{ij} between events can be expressed as the product of its
189 temporal and spatial components normalized by the magnitude of the earlier event i :

$$190 \quad \eta_{ij} = T_{ij} \cdot R_{ij} \quad (2)$$

$$191 \quad T_{ij} = t_{ij} 10^{-qbm_i}, R_{ij} = (r_{ij})^d 10^{-(1-q)bm_i}, 0 < q < 1. \quad (3)$$

192 We fix $q = 0.5$, providing equal weights to the temporal and spatial distances. To estimate
193 the spatial distance between events we used epicentral locations, since the vertical location
194 accuracy from these catalogs is lower than the horizontal. The parameter used values are $b = 1$
195 and $d = 1$, representing the epicentral distribution of seismicity as approximately linear, in
196 agreement with the seismicity distribution from fault structures. This method for identifying

197 seismicity clusters is generally not sensitive to moderate variations in these parameters (see
198 Zaliapin and Ben-Zion, 2013a for details), and equivalent results are obtained using for example
199 $b=1.2$.

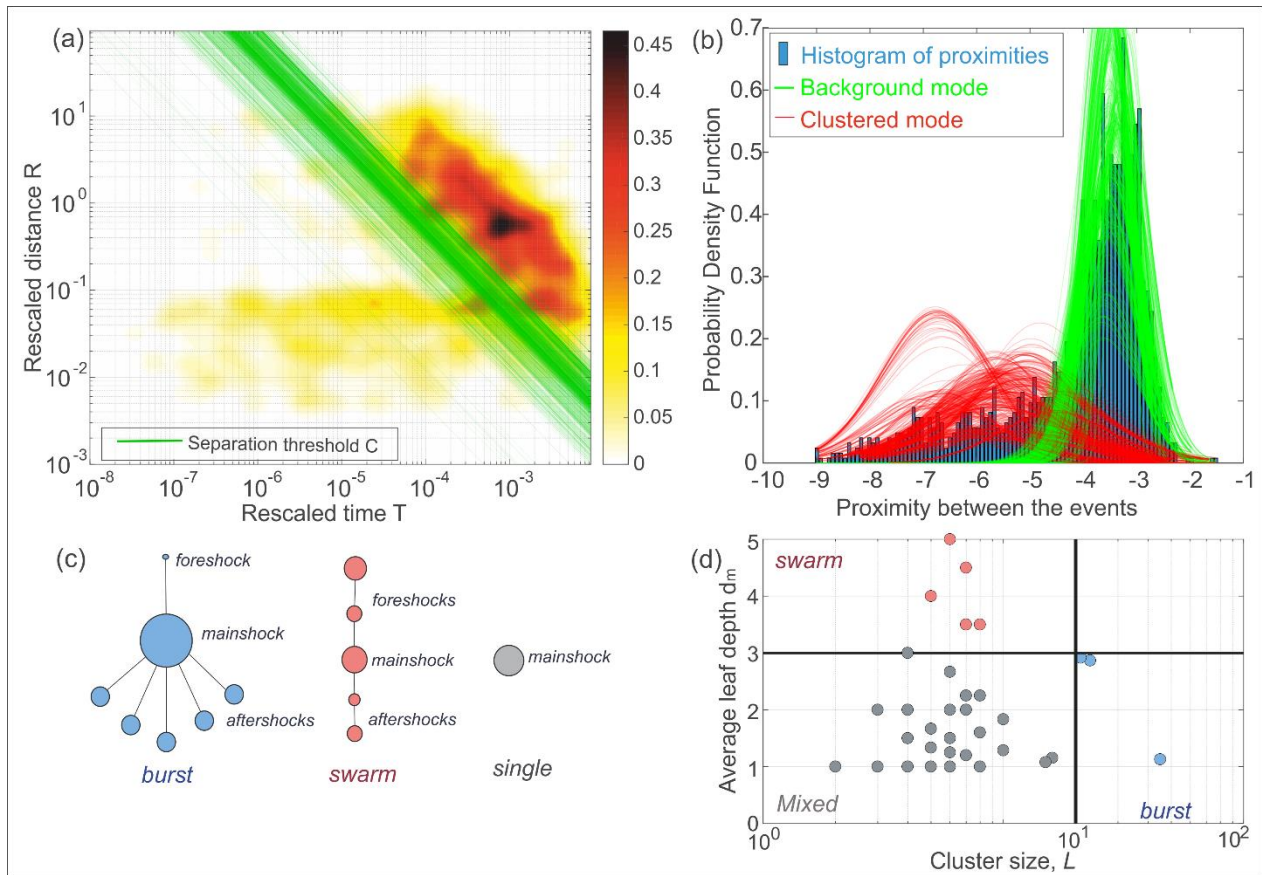
200 We denote by η_j the shortest of the proximities between event j and all earlier events. The
201 event at which this minimal value is attained is called the parent of j . The distribution of the nearest-
202 neighbor proximities η_j in observed catalogs is generally bimodal (e.g. Fig 2, Fig S3, Zaliapin et
203 al., 2008; Zaliapin & Ben-Zion, 2013a, 2016a). The long-proximity mode (representing rescaled
204 times and distances larger than the estimated separation threshold between the two seismicity
205 modes) roughly corresponds to *background* Poissonian-like seismicity, while the short-proximity
206 mode is associated with *clustered* earthquakes (i.e. foreshocks and aftershocks).

207 Individual clusters are formed by earthquakes that are connected by *short* proximity links.
208 Each earthquake connected to the parent by a long link is considered a *background* event and starts
209 a new cluster. A *single* is a cluster that consists of one background event with no associated
210 foreshocks or aftershocks, while the multiple-event clusters are called *families*. The largest event
211 in each cluster is called *mainshock*; all events within the cluster and prior to/after the mainshock
212 are called *fore/after-shocks* (see Fig. 6 of Zaliapin and Ben-Zion, 2013a).

213 In the Sea of Marmara region, the seismicity rates vary among the fault segments, and the station
214 coverage is not uniform since many of the fault segments run offshore. Therefore, the seismicity
215 can be represented as a non-homogeneous Poisson process in space. To account for this effect in
216 our cluster identification, we calculate the nearest-neighbor proximity η_j for each event using the
217 entire catalog, and implement a space-dependent threshold for each event that separates short and
218 long proximities in identifying individual earthquake clusters. The results of this analysis are
219 illustrated in Fig. 2. For each event, we start with a circular region of 2 km surrounding the event

220 and we iteratively increase the radius taking intervals of 1 km until the number of events contained
221 in the region is larger than 5% of the entire catalog (81 and 477 events for the Wollin and KOERI
222 catalog, respectively). The distribution of rescaled times and distances for these events is used to
223 estimate the separation threshold between short and long proximities from the initial event in the
224 center of the circular region. Using a distribution with a larger number of events (i.e. more than 5%
225 of the catalog) to estimate the event-based threshold results in smoothing the threshold variations
226 (therefore, decreasing the detection of non-homogeneous distributions). Conversely, decreasing the
227 number of events contained in the distribution to calculate the threshold allows detecting more
228 effectively non-homogeneities in the distribution of rescaled times and distances. The utilized
229 proportion of 5% was selected as optimal to effectively detect changes in the distributions of the
230 analyzed areas, but the main results are not affected when varying the proportion to within $\pm 10\%$.

231 To separate the *short* and *long* proximity modes of the seismicity in each window, we fit a
232 Gaussian mixture model with two modes to the logarithmic proximities $\log_{10} \eta_j$ (Zaliapin & Ben-
233 Zion, 2016); the threshold is defined as the point of equal density of the two estimated modes. Note
234 that the proportion of events used to estimate the event-based threshold between short and long
235 proximity modes does not affect or limit the number of events contained in each individual cluster.
236 Figs. 2a,b show the distribution of the nearest-neighbor proximity values, its rescaled components,
237 and the estimated space-dependent threshold. For most of the examined events, there is a clear
238 separation between the background and cluster mode, which is best seen in the 2D plot Fig. 2a.
239 The threshold values are concentrated around the value -4 ; the threshold distribution is left-skewed
240 with some extreme values as low as -7 and as high as -3.8 . Therefore, although it is more correct
241 to account for the effect of potential non-homogeneities in the distribution, this effect is not large
242 in our catalog and the main results are preserved using also a homogeneous threshold.



244 **Figure 2.** Cluster identification using Wollin et al. (2018) seismicity catalog. (a) Joint distribution
 245 of the rescaled time and space components (T , R) of the nearest neighbor proximity. Green lines
 246 show the separation thresholds obtained for different spatial portions of the catalog as discussed in
 247 Sect. 3.2. (b) Histogram of the nearest neighbor proximities (blue bars) showing a bimodal
 248 distribution of background and clustered events. The green and red lines show the result of fitting
 249 a Gaussian mixture model that identifies the background and cluster modes, respectively. (c)
 250 Conceptual sketch showing the topological structure of typical burst-like and swarm-like clusters
 251 as well as a single. The size of the circles is proportional to event magnitude. (d) Average leaf depth
 252 d_m vs cluster size L . This diagram guides in identifying swarm-like and burst-like clusters.
 253

255 3.3 Generalized linear regression models

256 To quantify differences in earthquake cluster properties among the analyzed fault segments
257 we use generalized linear models, which are an extension of ordinary regression that allows one to
258 work with non-normal data (Agresti, 2018). We examine three cluster statistics: The proportion of
259 earthquake families among the identified clusters (Section 4.1); the proportion of mainshocks that
260 are preceded by at least one foreshock (Section 4.3); and the duration of the foreshock sequences -
261 - the time between the first event in the sequence and the mainshock (Section 4.3). The latter
262 analysis is only performed in two regions -- the western and eastern Sea of Marmara. In all
263 experiments, the examined statistic is used as the model response and the region (as a categorical
264 variable) is a single model predictor.

265 The first two statistics are analyzed using the logistic regression model. Specifically, each
266 mainshock i is associated with a Bernoulli random variable Y_i that equals 1 if the mainshock has at
267 least one offspring (for the first model) or at least one foreshock (for the second model), and 0
268 otherwise. Furthermore, each mainshock is associated with region indicator (dummy) variables
269 x_1, \dots, x_p such that $x_j = 1$ if the examined mainshock belongs to region j , and $x_j = 0$ otherwise. The
270 model fits the values $\pi(\mathbf{x}) = P(Y = 1)$ as a function of the region indicators:

$$271 \pi(\mathbf{x}) = \frac{\exp(\alpha + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p)}{1 + \exp(\alpha + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p)}, \quad (4)$$

272 where α is the model intercept and $\beta = (\beta_1, \dots, \beta_p)$ are region coefficients. To avoid redundancy,
273 β_1 is set to 0. The null hypothesis H_0 : "The probability of success, $P(Y=1)$, is the same in all regions"
274 corresponds to $\beta_i = 0$ for all i . The model is equivalent to a linear expression for the logarithmic
275 odds of success:

$$276 \ln \left(\frac{P(Y=1|\mathbf{x})}{P(Y=0|\mathbf{x})} \right) = \alpha + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p.$$

277 The large-sample distribution of the estimated coefficients in this generalized linear model
278 is Normal (Agresti, 2018), which facilitate inference. The model also allows making inference
279 about the equality of proportions between two selected regions. Specifically, the logarithm of the
280 conditional odds ratio between two regions equals the difference between the estimated
281 coefficients:

$$282 \quad \ln \left(\frac{P(Y=1|x_i=1) P(Y=0|x_j=1)}{P(Y=0|x_i=1) P(Y=1|x_j=1)} \right) = \beta_i - \beta_j, \quad (5)$$

283 with zero difference corresponding to the null hypothesis: H_0 : "The probability of success is the
284 same in the two examined regions". Similarly, the third model fits the average sequence duration
285 $\mu(x)$ as a function of region indicator:

$$286 \quad \mu(x) = \alpha + \beta_1 x_1 + \beta_2 x_2. \quad (6)$$

287 The data for the different regions as well as the estimated coefficients in the three models are
288 provided in [Table S1](#).

289 4. Results

290 In the following, we present results obtained for the higher quality catalog from Wollin et al.
291 (2018). A comparison with results for the KOERI catalog (documented in supplementary materials)
292 is provided in the discussion.

293 4.1 Spatio-temporal properties of mainshocks and aftershocks

294 The nearest neighbor proximities show a bimodal distribution emphasizing the background
295 and clustered seismicity modes ([Figs 2a, b](#)). According to the respective cluster identification (Sec.
296 3.2), 70% of the events in this catalog are classified as *background* seismicity (i.e., 70% of
297 earthquakes are mainshocks). The highest background rates are observed in the Tekirdag Basin and
298 in the Cinarcik Fault– northern portion of the Armutlu Peninsula ([Fig 3a](#)). The remaining 30% of

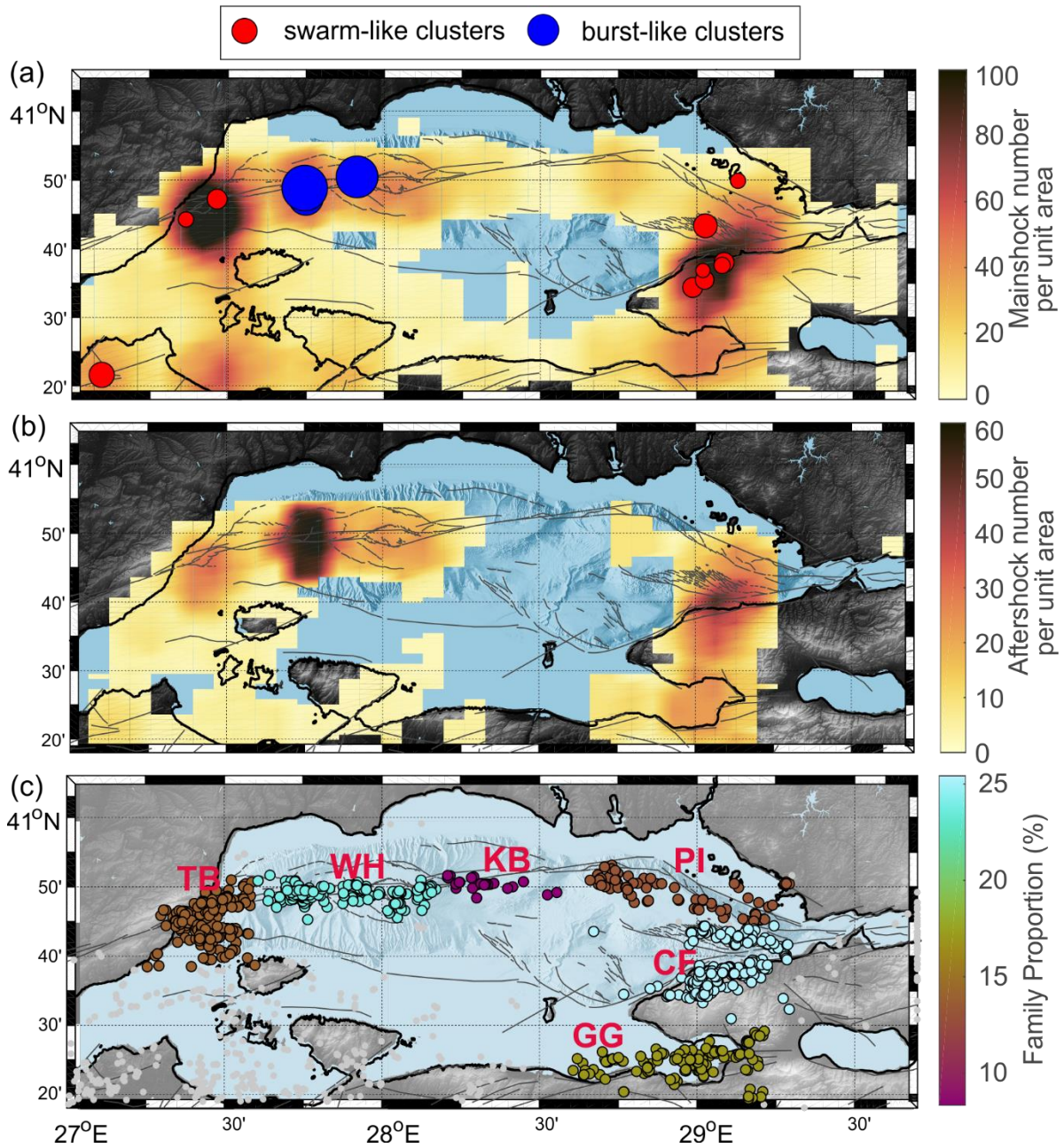
299 the dataset forms *clustered* seismicity, out of which 24% are *aftershocks* and 6% are *foreshocks*.
300 The largest concentration of aftershocks appears around the Western High, coinciding with the
301 location of the three largest events reported in the catalog (Mw 4.5, 4.5, 4.3), as well as in the
302 Cinarcik Fault (Fig 3b).

303 Each cluster identified as discussed in Sect. 3.2 is represented as a tree graph. We use the
304 following statistics of individual clusters (families): (i) cluster size L is the number of events in a
305 cluster; $L=1$ for singles, and $L>1$ for families, and (ii) topological leaf depth d_m , which is the
306 average distance from the cluster leaves to the root. When the earthquake *families* are sufficiently
307 large (i.e., the family size $L > 10$), two end-member family types have been previously identified
308 (Fig 2c). *Burst-like* sequences are characterized by a small value of d_m ; they are mostly comprised
309 of conventional mainshock-aftershock sequences. Such families are typical for regions of relatively
310 low heat flow and reduced fluid content. *Swarm-like* sequences, which are chains of events of
311 similar magnitude with no clear mainshocks, are characterized by a larger average leaf depth d_m
312 and are typical of regions with relatively high heat flow and/or high fluid content. Based on the
313 distribution of average leaf depths d_m and size L of our clusters, we identified some burst-like and
314 swarm-like clusters in our catalog (Fig 2d). The three *burst-like* sequences are located on the
315 Western High and they are related to the largest mainshocks contained in the catalog (Fig 3a).
316 Several swarm-like clusters were also identified, concentrating in the Tekirdag Basin and the
317 Cinarcik Fault – Armutlu Peninsula (Fig 3a). This suggests that these two regions could have larger
318 heat flow and/or presence of fluids than their surroundings.

319 We divide the study region into six areas containing one or more different fault segments
320 and calculate the proportion of mainshocks with associated *family* (e.g. foreshocks and/or
321 aftershocks) with respect to the total population of background events, which is the proportion of

322 families with respect to the total number of families and singles. The selected areas are (1) Ganos
323 Fault - Tekirdag Basin, (2) Western High-Central Basin, (3) Kumburgaz Basin, (4) Princess Islands
324 segment, (5) Cinarcik Fault - Armutlu Peninsula, (6) Gulf of Gemlik. Interestingly, clear
325 differences are visible in the proportion of families within each area. With about 25% of the
326 background events having family, the Western High-Central Basin and Cinarcik Fault contain the
327 largest proportion of families in the Sea of Marmara region (Fig 3c). Different proportion of *family*
328 mainshocks and *singles* among different regions could reflect either larger stress transfer (for
329 example due to the occurrence of larger earthquake magnitudes) or, alternatively, it could reflect
330 the proximity to failure of each of the regions.

331 We fit a logistic regression model to the six regions of the Sea of Marmara to check how
332 significant the differences between family proportions within examined regions are (Section 3.3).
333 Selecting the Tekirdag Basin (TB) region as a reference with $\beta_1 = 0$, larger values of the
334 coefficients $\beta_2 = 0.67$ (WH) and $\beta_5 = 0.75$ (CF) agree with the larger family proportions found
335 in these two regions (Table S1). These are also the only two coefficients with p -value < 0.05 , thus
336 indicating that they are statistically different from the reference region TB. A complete pairwise
337 comparison of the estimated proportions, based on the odds ratio estimation of Eq. (5) and Fisher
338 exact test in a 2x2 table is illustrated in Table 1 (elements above diagonal). Recall that the null
339 hypothesis H_0 : “The probabilities of success are the same in both regions” corresponds to the odds
340 ratio equal to unity. The odds ratio above (below) one suggests that the probability of success is
341 higher (lower) in the first of the two examined regions. The results suggest two groups of regions
342 having statistically different proportion of mainshocks with families: regions WH and CF show a
343 higher proportion of families (24.00% and 25.42%, respectively), while the other four regions have
344 a smaller proportion of approximately 13%.



346
 347
 348 **Figure 3.** (a) Number of mainshocks per unit area. Blue and red color circles represent the
 349 mainshocks from identified bursts and swarms, respectively, according to the threshold displayed
 350 in Figure 2d. Size of the circle is encoded with mainshock magnitude. (b) Number of aftershocks
 351 per unit area. (c) Proportion of families among different sections of the Sea of Marmara. The initials
 352 beside each fault region represent the following: (TB) Ganos section-Tekirdag Basin, (WH)

353 Western High-Central Basin, (KB) Kumburgaz Basin, (PI) Princess Islands segment, (CF) Cinarcik
 354 Fault - Armutlu Peninsula, (GG) Gulf of Gemlik.

355

	TB	WH	KB	PI	CF	GG
TB		0.51 (0.03)	1.77 (0.74)	1.06 (1)	0.47 (<0.01)	0.79 (0.50)
WH	0.48 (0.15)		3.45 (0.11)	2.06 (0.09)	0.93 (0.79)	1.54 (0.20)
KB	-	-		0.6 (0.72)	0.27 (0.07)	0.45 (0.37)
PI	1.01 (1.00)	2.09 (0.39)	-		0.45 (0.04)	0.75 (0.53)
CF	0.39 (0.03)	0.80 (0.70)	-	0.38 (0.14)		1.67 (0.11)
GG	0.99 (1.00)	2.07 (0.21)	-	0.99 (1.00)	2.57 (0.08)	

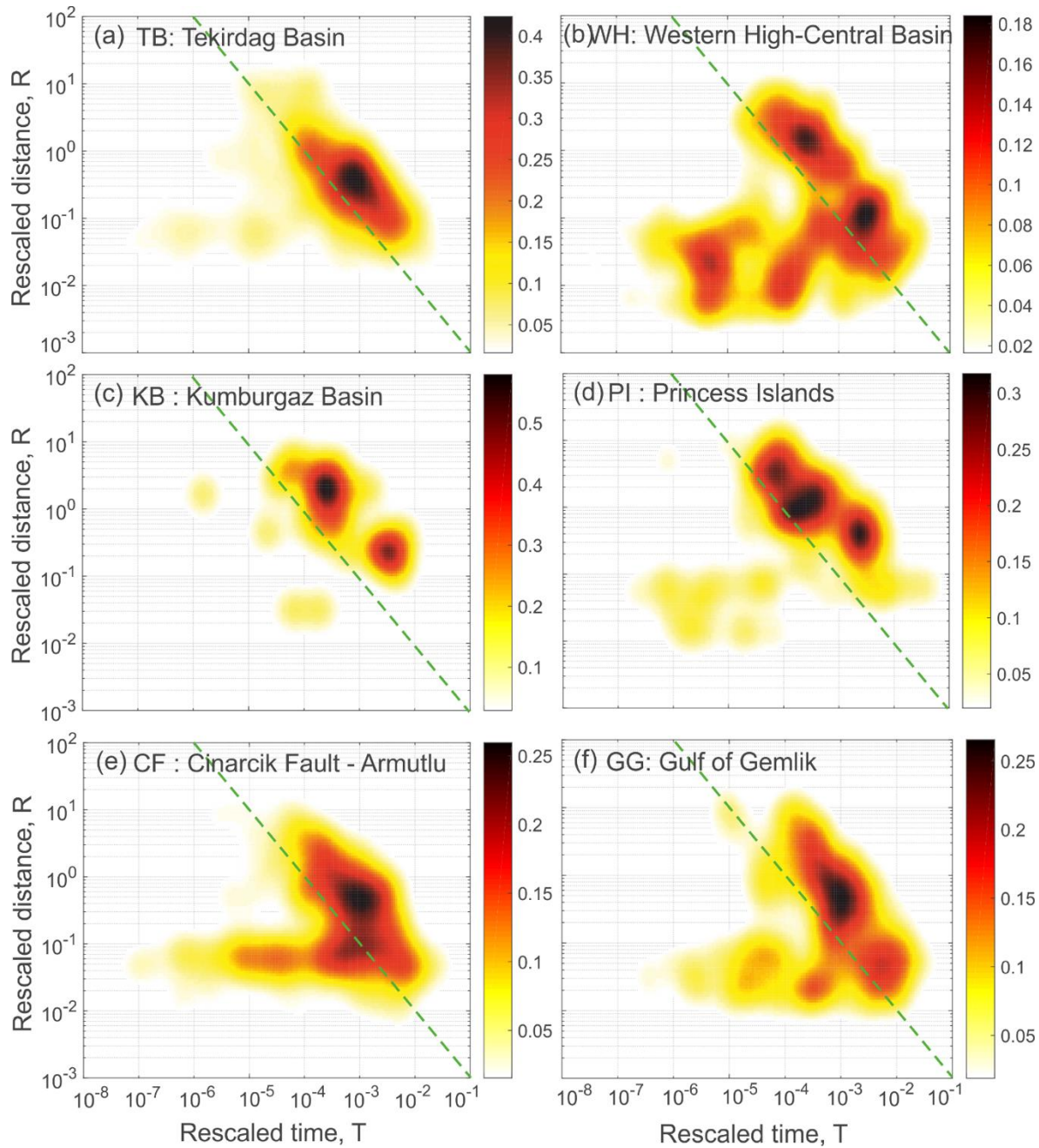
356
 357 **Table 1:** Pairwise regional comparison of the proportion of mainshocks with offspring (top part of
 358 the table) and mainshocks with foreshocks (bottom part of the table). Each cell shows the estimated
 359 odds ratio and the respective p -value (in parentheses), according to the Fisher exact test. Cells with
 360 p -value below 0.1 are shown in black, the rest in gray. The odds ratio above (below) one suggests
 361 that the probability of success is higher (lower) in the region indicated in the first column.

362 4.2 Nearest neighbor distributions to identify earthquake repeaters

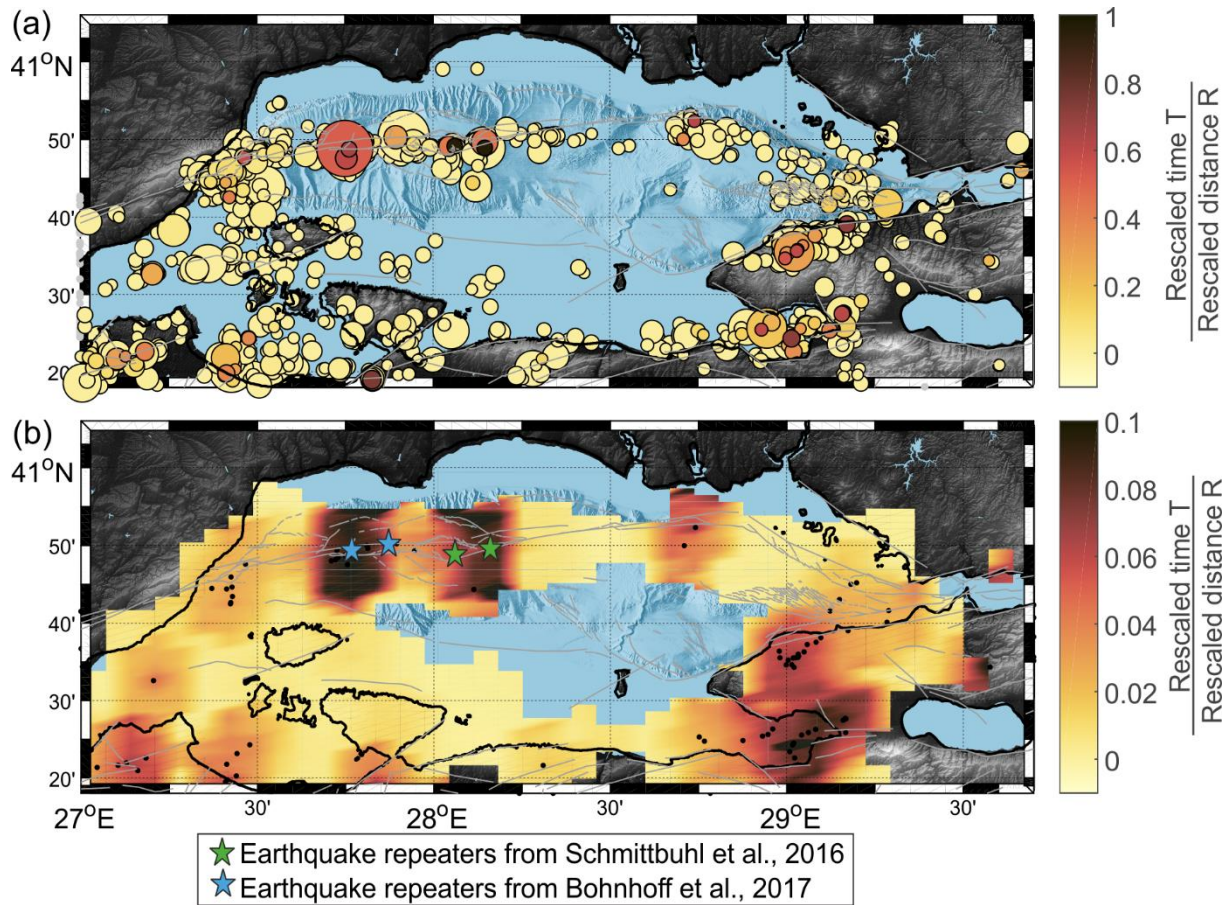
363 The distribution of the nearest-neighbor proximity differs substantially among the six
 364 analyzed sections (Fig. 4). In the Terkirdag and Kumburgaz Basins, nearly no clustered seismicity
 365 is observed (Figs, 4a 4c), implying that the majority of the seismicity correspond to background.
 366 The Western High-Central Basin display an unusual clustered mode with lower rescaled distances
 367 R than any of the other regions (Fig 4b), suggesting that the events tend to occur closer to each
 368 other than in other fault regions. Both Western High-Central Basin and the Armutlu Peninsula
 369 display the largest density in the clustered mode area (Figs 4b, 4e).

370 The Western High – Central Basin and Gulf of Gemlik areas have a larger proportion of
 371 events displaying relatively low rescaled distance R and high rescaled time T (Figs 4b, 4f). We
 372 refer to events with these features as “*earthquake repeaters*”, since they occur after a long time

373 with respect to its parent event but in a very similar location (Schoenball et al., 2015; Zaliapin &
374 Ben-Zion, 2016b). This purely statistical definition is somewhat different from that of classical
375 *earthquake repeaters*, which are events whose source locations overlap and recurrence statistics
376 are relatively periodic (e.g. Poupinet et al., 1984; Nadeau & McEvilly, 2004). We calculated for
377 each event the ratio T/R , where increased value corresponds to earthquake repeaters. Individual
378 earthquakes with the largest T/R (Fig 5a) as well as regions with the largest average T/R (Fig 5b)
379 are located at both sides of the Central Basin- Western High. Interestingly, these regions have
380 documented traditional earthquake repeater sequences (Schmittbuhl et al., 2016a; Bohnhoff et al.,
381 2017). This indicates that the nearest-neighbor analysis could provide insight on classical repeater-
382 prone regions. Furthermore, the analysis indicates that the Gulf of Gemlik region also display large
383 T/R . This suggests that classical earthquake repeaters may also be found in that region.



384
 385
 386 **Figure 4.** Joint distribution of the rescaled components (T , R) of the nearest-neighbor proximity in
 387 the six examined regions. (a) Ganos section – Tekirdag Basin, (b) Western High – Central Basin,
 388 (c) Kumburgaz Basin, (d) Princess Island segment, (e) Cinarcik Fault – Armutlu Peninsula, (f) Gulf
 389 of Gemlik. Note that a green line corresponding to $\eta = -4$ has been added to all panels only to
 390 facilitate visual comparison.



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392
393

Figure 5. (a) Map of the background seismicity in the Sea of Marmara using the catalog of

394

Wollin et al. (2018). Colors represent the ratio T/R between rescaled time and distance from the

395

parent event . (b) Similar map as in (a) with color code corresponding to the ratio T/R smoothed

396

by a kernel density estimation.

397

4.3 Characterization of foreshock properties

398

The cluster analysis indicates that 6% of the events in the examined catalog are *foreshocks*.

399

The density of foreshocks peaks around the Cinarcik Fault - Armutlu Peninsula (Fig 6a), where

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several foreshocks were detected prior to the 2016 Mw 4.4 earthquake (Malin et al., 2018). To

401

provide a better context for such studies, we calculate the proportion of mainshocks that have at

402

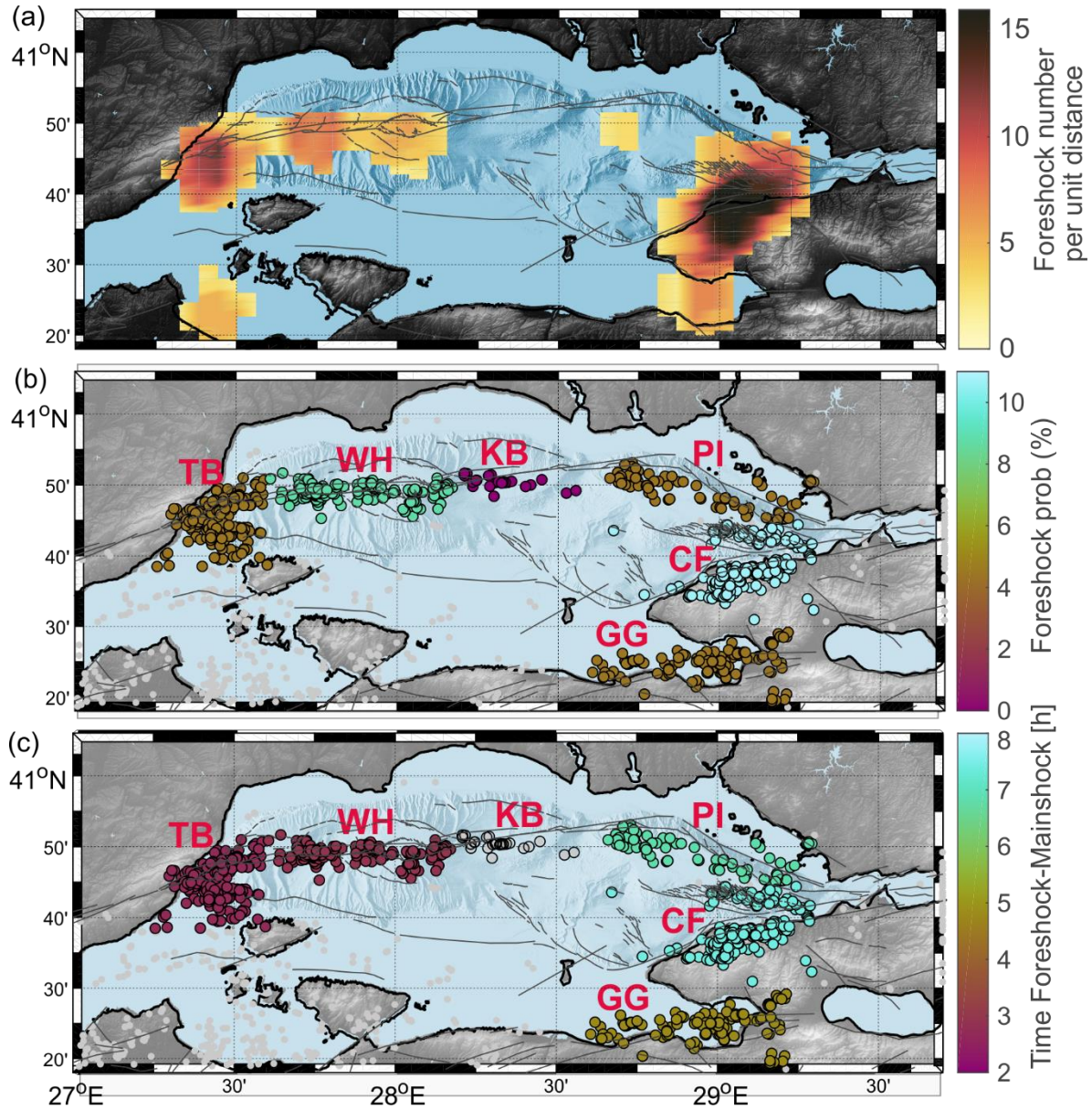
least one foreshock in the six analyzed regions. The CF has the highest proportion (12%) of such

403 mainshocks (Fig 6b). It is followed by the WH with 8%. The smallest proportion (0%) is found in
404 the KB, where no foreshocks are identified (Fig 6b). However, the number of events in this region
405 is rather small.

406 We use the generalized logistic regression to quantify significance of the differences in the
407 proportions of mainshocks preceded by at least one foreshock among the different segments in the
408 Sea of Marmara (Tables S1). Using the TB region as reference, the highest proportion of mainshocks
409 with foreshocks is found for the CF, the respective coefficient $\beta_5 = 0.95$ is significantly different
410 from the reference value $\beta_1 = 0$ (Figure 6b). A complete pairwise comparison of the estimated
411 proportions, analogous to that performed in section 4.1 is illustrated in Table 1 (values below
412 diagonal). These pairwise comparisons do not include KB, which shows no foreshocks. The most
413 significant differences are seen when comparing the CF to the TB and the GG, with the CF region
414 having significantly higher proportion of foreshocks (10.73%) than the other two regions (4%). The
415 differences between the other segments do not appear statistically significant, which in some cases
416 might be due to small sample sizes.

417 We also quantify the median time between the first foreshock of the sequence and the
418 corresponding mainshock. Interestingly, the duration of the foreshock sequences appears to be
419 different between the east and west of the Sea of Marmara. The east region (including Princess
420 Islands, Cinarcik Fault and Gulf of Gemlik) displays a median time between first foreshock and
421 mainshock of 6.83 hours (Fig 6c, Table S1). In contrast, the west (including Ganos Fault, Tekirdag
422 Basin, Western High, Central Basin, Kumburgaz Basin) has an overall foreshock duration of only
423 2.90 hours (Fig 6c, Table S1). In the next step, we fit a generalized linear model to the data from
424 the duration of the foreshock sequences of the western and eastern Sea of Marmara. The large β_2
425 coefficient indicates that the available sequences from eastern Marmara have a larger duration of

426 the foreshock sequence. However, the differences suggested by the data are not significant (p -value
427 of 0.1), which might be due to small sample sizes. Further data are needed to statistically confirm
428 the two-fold increase in the foreshock sequence duration observed in the examined regions.



429
430
431 **Figure 6.** (a) Number of foreshocks per unit of area. (b) Proportion of mainshocks that have at least
432 one associated foreshock or more. (c) Median duration of foreshock sequences. Initials beside the
433 section are defined in Fig 3d.

434 5. Discussion

435 5.1 Consistency of results between the catalogs

436 We analyzed two earthquake catalogs of varying quality in the Sea of Marmara region to
437 investigate the consistency of the clustering features between the catalogs. In Section 4 we focused
438 on the Wollin et al. (2018) catalog of larger quality. Here we first compare these results with those
439 obtained using the KOERI catalog.

440 The obtained proportion of background seismicity and aftershocks as well as their spatial
441 distributions are very similar in the KOERI catalog (Fig S3, Fig S4). Setting an analogous threshold
442 as in the case of the Wollin et al. catalog to identify burst and swarm-like clusters, shows that the
443 epicentral locations of burst and swarms are also consistent.

444 Analysis of the parameter T/R using the KOERI catalog shows also similar features;
445 however, the differences between the segments are less clear (Fig S1, S5). Using the T/R
446 parameter, the same maximum around the Western High – Central Basin is found, but the
447 maximum around the Gulf of Gemlik is more diffuse and it covers the entire eastern Sea of
448 Marmara (Fig S1). This is interpreted as a signature of the comparatively lower quality of the
449 catalog, which could smear the results that appear sharper with the Wollin et al. catalog.

450 The proportion of 6% of foreshocks is also found by using the KOERI catalog. However,
451 the foreshock statistics are not consistent within the two catalogs (Fig S6). These features may be
452 more sensitive to various factors such as poor epicentral locations or inaccurate magnitude
453 estimation and they may only be recovered with higher-quality seismicity catalogs.

454 5.2 Background, aftershock and foreshock rates with respect to other faults

455 About 70% of the seismicity catalog represents background seismicity (i.e. *mainshocks*),
456 while only 24% and 6% represent aftershock and foreshock sequences, respectively. Interestingly,

457 a similar proportion of foreshocks to the one found here (6%) was reported in early studies of the
458 seismicity catalog in southern California (Jones, 1985), as well as at global scale (Zaliapin & Ben-
459 Zion, 2016a). A closer look indicates that areas of lower and higher heat flow tend to display lower
460 and higher foreshock rates, respectively (Zaliapin & Ben-Zion, 2013b). The high proportion of
461 background seismicity is comparable to that found in the San Jacinto strike-slip fault in California
462 (Zaliapin & Ben-Zion, 2016b), but lower than the background proportion found at global scale
463 (Zaliapin & Ben-Zion, 2016a). Similarly, the encountered proportion of aftershocks (24%) is also
464 lower than at global scale (41%, see Zaliapin & Ben-Zion, 2016a). The reduced proportion of
465 aftershocks in the Sea of Marmara could be partially due to the small range of magnitudes (M_w
466 [2.1 4.5]) included in the analyzed catalog, or could reflect an incompleteness of detected events
467 in the lower magnitude range.

468 The majority of the observed *swarm*-like clusters tend to concentrate around the Cinarcik
469 Fault - Armutlu Peninsula. This area is known to have relatively higher heat flow than the
470 surroundings as well as enhanced presence of fluids (e.g. Kinscher et al., 2013). These factors tend
471 to reduce the effective viscosity of the crust and were found to promote the existence of swarms in
472 southern California (Zaliapin & Ben-Zion, 2013b) and worldwide (Zaliapin & Ben-Zion, 2016a).
473 Therefore, although a detailed map of heat in the Sea of Marmara is not available, the obtained
474 results are in agreement with similar findings worldwide.

475 **5.3 Foreshock distribution and potential for monitoring earthquake nucleation**

476 The Sea of Marmara region is considered as a seismic gap that can rupture in a $M > 7$
477 earthquake during this century (Bohnhoff et al., 2013; Ergintav et al., 2014). Monitoring and
478 identifying potential earthquake preparation processes that may give some information about the
479 increased probability of occurrence for a larger earthquake remains of uttermost importance,

480 especially in the light of the adjacent Istanbul Metropolitan area. The occurrence of foreshocks
481 preceding a mainshock is of importance, because of their potential use as an alert of the activation
482 of the corresponding region. However, the main challenge in operational analysis of premonitory
483 foreshocks is that the very definition of this event type is conditioned on the occurrence of a later
484 mainshock. There are no criteria to classify an earthquake as a foreshock prior to the mainshock
485 occurrence.

486 Our results show that the largest proportions of mainshocks preceded by foreshock activity
487 occur on the Cinarcik Basin – Armutlu Peninsula and the western high – Central Basin area.
488 Together with pre-seismic slip, foreshocks are one the few indications of an upcoming larger
489 earthquake. The results of this study provide information on the overall likelihood of foreshocks in
490 different fault sections in the Sea of Marmara region. In addition, the duration of the foreshock
491 sequences, and consequently, the available time to detect and identify the preparation process is
492 observed to be larger in the eastern than in the western fault segments.

493 **5.4 Are nearest neighbor distributions useful to identify earthquake repeaters?**

494 Characteristic repeating earthquakes rupturing the same fault patch over quasi-periodic time
495 intervals can improve detection of aseismic slip sources as well as an estimation of the creeping
496 rates (e.g. Poupinet et al., 1984; Nadeau & McEvilly, 2004). In the Sea of Marmara, classical
497 earthquake repeater sequences have been identified in the Western High and the Central Basin
498 (Schmittbuhl et al., 2016a; Bohnhoff et al., 2017). Here, we have utilized a nearest neighbor
499 approach to search for areas where the rescaled distance and time of a given event to its parent is
500 anomalously small and large, respectively. The areas displaying relatively larger T/R coincide well
501 with previously mapped locations of earthquake repeaters in the Sea of Marmara. Therefore, the
502 nearest neighbor technique appears to provide simple indications of the areas where earthquake

503 repeaters in combination with aseismic slip could be present. Furthermore, the analysis reported
504 additional indication for earthquake repeaters in the Gulf of Gemlik. A search for classical
505 earthquake repeaters in this area should to be done in a future study.

506 **5.5 Proportion of earthquake families and proximity of a fault segment to failure**

507 The proportion of earthquake families within a population allows quantifying the role of
508 earthquake interaction within a certain fault segment. Since the stress transfer from the occurrence
509 of $M_w < 4.5$ earthquakes is in the order of few kPa in the surrounding mainshock area (e.g. Rothert
510 & Shapiro, 2007), this small stress transfer should be sufficient to bring the crust to failure and
511 trigger aftershocks. Therefore, larger proportion of earthquake families may be typical of areas
512 where the crust is closer to failure, or alternatively, where the stress transfer is larger.

513 The Western High-Central Basin and the Armutlu Peninsula display the largest proportion of
514 earthquake families within the Sea of Marmara region (Fig 3c), suggesting that they are more
515 susceptible to earthquake triggering. This possibly indicates that these segments are closer to failure
516 than the other analyzed segments in the Sea of Marmara. Other small perturbations of the same
517 magnitude as the earthquake interaction may also trigger seismicity in these segments. For
518 example, the passing of surface waves from a large regional or teleseismic event have been
519 observed to trigger seismicity in fault segments closer to failure (e.g. Aiken et al., 2015). Indeed,
520 the largest triggering of aftershocks after the M_w 7.1 1999 Izmit earthquake occurred in the
521 Armutlu Peninsula (Durand et al., 2010). It is therefore expected that these two regions may also
522 be susceptible to triggering from other small stress perturbations, such as tidal oscillations or
523 seasonal changes in the level of the water mass.

524 **6. Conclusions**

525 We analyzed clusters of seismicity in the Sea of Marmara region, NW Turkey, utilizing a high-
526 quality relocated hypocenter catalog and the nearest neighbor earthquake distance approach. The
527 main conclusions of our analysis are as follows:

528 (1) About 70% and 24% of the hypocenter catalog are identified as mainshocks and aftershocks,
529 respectively. Largest background rates are observed around the Tekirdag Basin and the
530 Cinarcik Fault. The largest density of aftershocks is observed around the Western High,
531 coinciding with the location of the largest events in the catalog.

532 (2) About 6% of the events in the hypocenter catalog are identified as foreshocks. The largest
533 proportion of foreshocks is found in the Cinarcik Fault and Armutlu Peninsula, a region known
534 to have elevated heat flow and hydrothermal systems.

535 (3) Significant differences in selected cluster statistics are observed among the examined fault
536 segments. The technique also successfully identifies regions where earthquake repeaters have
537 been observed, and suggests additional repeaters in the Gulf of Gemlik.

538 (4) The Western High and Cinarcik Fault – Armutlu Peninsula display the largest proportion of
539 earthquake families, which might be an indicator that these segments are closer to failure. This
540 suggest a higher susceptibility of earthquake triggering from teleseismic earthquakes in these
541 two regions.

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