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Resolving Northern Alaska Earthquake Sequences Using the Transportable Array and Probabilistic
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1 Resolving Northern Alaska Earthquake Sequences Using the

2 **Transportable Array and Probabilistic Location Methods**

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24 ABSTRACT

Between 2014 and 2017, almost 200 new seismic stations were installed in Alaska and northwestern 25 26 Canada as part of the EarthScope USArray Transportable Array (TA). These stations currently provide 27 an unprecedented capability for the detection and location of seismic events in regions with 28 otherwise relatively sparse station coverage. Two interesting earthquake sequences in 2018/2019 in 29 the north eastern Brooks Range were exceptionally well recorded due to this deployment. First is the 30 aftershock sequence of the M_w 6.4 and M_w 6.0 Kaktovik earthquakes of 12 August 2018, the largest 31 earthquakes recorded to-date in the region. The second is the Niviak swarm, southwest of the Kaktovik sequence. Since July 2018, over 4000 earthquakes between magnitudes 1 and 4.3 have 32 33 been recorded across a region exceeding 5000 square kilometers. We explore how the Bayesloc 34 probabilistic multiple seismic event location algorithm can better resolve features of these two 35 sequences, exploiting the large numbers of readings that the improved station coverage provides 36 from events down to magnitudes below 2. The Bayesloc calculations consistently move events in the 37 Kaktovik sequence a few kilometers to the northeast, providing an almost linear ESE-striking southern limit to the aftershock zone. Analysis of the Bayesloc joint probability distribution of 38 39 corrections to travel time predictions indicate that anomalously fast wave propagation to the 40 southwest is likely the most significant contribution to the seismic event mislocation. The joint relocations are more consistent with InSAR-inferred coseismic displacement than the network 41 42 location estimates. The Bayesloc relocation of the Niviak events confirms that the earthquakes are distributed between many distinct clusters of seismicity which have clearer spatial separation 43 44 following the relocation. The probabilistic relocations motivate both double-difference studies to 45 better resolve clustered seismicity at the smallest spatial scales and systematic multiple event 46 relocation studies to calculate structure and travel time corrections over larger scales.

47 **INTRODUCTION**

Between 2004 and 2015, the EarthScope USArray Transportable Array (TA) of ~400 digital broadband 48 49 seismometers was deployed from west to east across the "Lower 48" states, with stations remaining 50 in place for 1.5-2 years before being moved to a new location to the east. Deployment in Alaska and 51 northwest Canada began in 2014 after initial test installs, and the full network was operational by the 52 end of the 2017 field season. A comprehensive review of the deployment is provided by Busby and 53 Aderhold (2020). Whereas the permanent networks are concentrated in the most seismically active regions of Alaska, the TA provides a remarkably uniform coverage of the remaining territory. Ruppert 54 and West (2020) discuss the lowering of the seismic detection thresholds that the additional stations 55 56 provide and draw attention to two extensive seismic sequences in the relatively aseismic regions, 57 which could only be characterized to the degree they are because of the TA presence. The first is the 58 aftershock sequence of the 12 August 2018 M_w 6.4 Kaktovik earthquake, the second is the 2018-59 2019 Eastern Brooks Range sequence (Figure 1). 60 Seismicity in northeastern Alaska is distributed over a ~200-km-wide, ~500 km-long zone that trends 61 southwest to northeast. The northern limit of this zone extends into the Beaufort Sea, while its 62 southern end is truncated by the Tintina Fault, a major right-lateral strike slip fault that extends 63 eastward into Canada. Earthquakes have been recorded in this region since regional monitoring began in the early 1970s (Gedney et al., 1977; Estabrook et al., 1988). Although the seismic record 64 65 until recently has been poor, moderate-sized earthquakes have been recorded in the region for decades, albeit with highly variable accuracy. There has been one magnitude 5 or greater earthquake 66 67 every few years on average. The earthquakes have occurred throughout the entire region, generally 68 do not follow well-defined linear trends, and sometimes present swarm-like behavior for months to 69 years before returning to its previous state.

There are no mapped active faults between the Tintina fault to the south and the offshore faults in
the Beaufort Sea to the north (Koehler et al., 2012). Given the extensive seismicity in the area,

72 however, this apparent lack of active faults may be attributed to limited geologic field mapping,

vhich is due in large part to the remoteness of the area and the challenges this presents for

- vindertaking geologic mapping studies. Crustal seismicity of northeastern Alaska has long been
- recognized as an earthquake hazard; it has been attributed to far-field deformation from the
- subduction of the Pacific plate compounded by collision of the Yakutat block by a variety of studies
- 77 (e.g., Mazzotti and Hyndman, 2002; Leonard et al., 2008; Mazzotti et al., 2008).

78 Gaudreau et al. (2019) provide a thorough study of the August 2018 earthquake and aftershock

requence both with seismological and InSAR data. They find that seismological location estimates of

80 the mainshock and numerous aftershocks are a few kilometers to the south of the InSAR-inferred

81 fault plane and discuss hypotheses for the discrepancy. These include the possibility of instrumental

timing errors, which could be significant given the unfavorable azimuthal station coverage. They

83 conclude that heterogeneous velocity structure in the crust is a more likely explanation. In this study

84 we try to resolve the issue by applying the Bayesloc probabilistic multiple-event location algorithm

85 (Myers et al., 2007) which has been shown to provide improved locations for clustered seismicity,

86 partly by mitigating the influence of velocity heterogeneity. This procedure provides both

87 probabilistic hypocenter and origin time estimates for the earthquakes and estimates of bias and

88 uncertainty in travel time predictions. We present Bayesloc relocations of earthquakes in both

sequences and provide justification as to why we can have confidence in the results.

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92 AFTERSHOCKS OF THE 12 AUGUST 2018, M_w 6.4 KAKTOVIK EARTHQUAKE

Figure 2a) displays locations of events in the Alaska Earthquake Center (AEC) catalog likely to be 93 94 associated with the 12 August 2018 Kaktovik earthquake sequence, based on location and time. 95 Earthquakes in this catalog are located by automatic detection algorithms and later reviewed event-96 by-event by human analysts who correct erroneous auto-picks and add more phase picks that the 97 auto-detectors may have missed. We apply Bayesloc, which locates multiple events simultaneously in 98 a probabilistic framework, to see if structure can be identified in the aftershock distribution not 99 found in the network locations. The motivation is that Bayesloc seeks a joint probability distribution 100 of all event hypocenters, origin times, arrival time uncertainty, and corrections to travel time 101 predictions, and may be able to compensate for geologic heterogeneity and consequent deficiencies 102 in the underlying velocity model used. In contrast, the network solutions are forced to assume zero-103 mean Gaussian distributions for all uncertainties and are therefore unable to identify bias in any 104 parameters common to multiple events. Gibbons and Kværna (2017) applied Bayesloc to the 105 aftershocks of the October 2005 Kashmir earthquake and found far more structured event clusters 106 than could be resolved in the single-event network solutions. In that case study, the primary cause of 107 mislocation in the network solutions was deemed likely to be anomalous travel times to stations at 108 regional distances. The probabilistic estimates for travel time corrections transformed the clouds of 109 aftershocks to align convincingly with the strike of the surface rupture. Bayesloc was applied by 110 Hayes et al. (2015) for accurate relocations of aftershocks from the Mw 7.8 April 2015 Gorkha earthquake, Nepal, by Nealy et al. (2017) to constrain the 2008 Wells, Nevada, sequence, and by Pyle 111 112 et al. (2015) to provide accurate event locations for seismicity in Rock Valley, Nevada. 113 Whereas the relocation of the Kashmir aftershocks involved a significant repicking of arrivals from 114 raw waveform data, it is important to note here that all Bayesloc solutions presented use exactly the 115 same set of arrivals as the AEC network location estimates. A 1D velocity model was prescribed based upon profiles presented in Fuis et al. (1997) and travel time tables were calculated for Pg, Pn, 116

117 Pb, Sg, Sn, Sb phases (see Storchak et al., 2003) for distances up to around 15 degrees, as applicable,

for input to the Bayesloc program. Additional travel time tables containing the travel time for the 118 first arriving P and first arriving S phase were also calculated and labelled P1 and S1. Following the 119 120 practice of Gibbons et al. (2017), relocating seismicity along the North Atlantic spreading ridge, we performed a parallel calculation using a different basis velocity model (in this case AK135, Kennett et 121 122 al., 1995) to confirm that the final joint probability distribution of event hypocenters was largely 123 stable to small changes in the underlying 1D velocity model. As seen in Figure 1, there are stations 124 ranging from a few tens of kilometers to many hundreds of kilometers and so the identification of 125 the first arriving phase will change with distance. There may be uncertainty regarding the 126 identification of the first arriving phase in some regions. All first P and S arrivals from the AEC bulletin were initially labelled P1 and S1 and we exploit the Bayesloc probabilistic identification of phase 127 labels (Myers et al., 2009) to attribute the most likely label to each arrival given the most probable 128

129 location.

130 Figure 2b) shows the distribution of mean event hypocenters from a run of Bayesloc with no priors 131 on the event locations and a total of 40000 iterations. The diffuse southern boundary of the network 132 solutions becomes a sharper edge with an ESE strike direction, a few kilometers north of the 133 southernmost epicenters from the AEC catalog. The contrast between the two sets of event locations 134 is more easily seen in Figure 2c) in which the relocations are plotted on top of the catalog location 135 estimates. The northern boundary of the aftershock cloud remains diffuse and largely unchanged in 136 the relocations. We display the surface projections of the InSAR-modelled western and eastern fault 137 segments from Gaudreau et al. (2019) in each of panels a), b) and c). In panel a), the network 138 location estimates almost all lie to the south of these two lines. In panel b), the southern extent of the relocated events is approximately parallel to the western fault and the northern extent of the 139 140 relocated events is approximately parallel to the eastern fault. In Figure 2d) we illustrate how the 141 events in different regions of the aftershock zone are moved. Essentially all events are shifted in a 142 northeasterly direction. Events in the western part of the aftershock zone may be relocated more in 143 a northerly direction, and events in the eastern part of the aftershock zone in a more easterly

- direction, although the pattern is quite consistent. The relocations obtained using the AK135 model
- as a basis are essentially identical to those displayed in Figure 2.
- 146 In Figure 3 we display both the distance and direction of each relocation. The majority of the larger
- 147 events are relocated to the northeast by between 2 and 10 km. Events which are relocated in a
- significantly different direction are low magnitude events and may be subject to far poorer location
- 149 constraints to begin with due to fewer phase-arrival readings and poorer azimuthal coverage. Figure
- 150 3 demonstrates that, whereas the overall change of shape of the aftershock cloud is significant, the
- 151 relocations of the individual events are modest. Given the station geometry, the relocated epicenters
- 152 lie well within the formal uncertainty ellipses of the AEC catalog locations. The elliptical distribution
- 153 of the relocation vector end-points provides an indication of consistency between the two sets of

154 location estimates. Whereas an identical set of phase arrival times is used to construct both sets of

155 origin estimates, the two location procedures are entirely independent; no information about the

156 catalog event locations is used as prior information for the Bayesloc calculation.

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163 VALIDATING AND INTERPRETING PROBABILISTIC EARTHQUAKE RELOCATIONS

- 164 The underlying algorithm in Bayesloc is iterative. It is instructive to examine the progress of the
- solution from start to end understand why the resulting pattern of hypocenter estimates may
- 166 provide a higher confidence image of the seismicity. The latitude, longitude, depth, and origin times
- 167 of the events, the uncertainties associated with the arrival time estimates, and corrections to the
- travel time estimates for each of the arrivals form a large parameter space for a given input. The
- 169 Monte Carlo Markov Chains in the Bayesloc algorithm explore this parameter space to try to
- 170 converge to a solution which best supports the full set of observations. The process starts with no
- 171 knowledge of the true parameters (unless prior information is available and provided) and probes
- 172 stochastically through different alternatives, identifying favorable choices.

173 In Figure 4a) we see as plain white symbols the final mean epicenters of all the events. Superimposed 174 onto this image are the location estimates at each iteration for a single selected event, displayed as 175 small colored dots to indicate the iteration number. (Only the first 10000 iterations are displayed 176 since changes in the epicenter estimates do not change significantly beyond that number.) Blue dots 177 in Figure 4a) indicate trial epicenters for this event in the earlier iterations and red dots indicate trial 178 epicenters towards the end. The most important features in the model parameter space in the 179 presence of geologic or velocity structure heterogeneity are the corrections to travel time predictions. Gibbons et al. (2017) demonstrated very large travel time residuals for individual 180 181 regional station-phase combinations that were consistent from event-to-event over wide 182 geographical regions: biases far larger than the uncertainty in the arrival time estimates themselves. 183 This is why we plot (in Figure 4b) the observed minus predicted travel time residual of a given phase 184 arrival at a given station for every hypocenter and origin time estimate for this event as a function of 185 the iteration number. The convergence (or otherwise) of this parameter, and the corresponding parameters for other phase/station combinations, provides an indicator as to whether the process 186 has converged on a solution. This offers an insight into how the event locations might relate to local 187 188 velocity structure.

The station and phase combination displayed in Figure 4b) is the first P-arrival at station D25K, the 189 190 closest station southwest of the aftershock zone. Before describing the evolution of this time residual with iteration number, it is worth taking the time to consider what values of this parameter would 191 192 imply about the velocity structure between the aftershock zone and this station. How would the 193 values be affected by an analyst reading error, or a clock error? If we assume that the analyst placed 194 the arrival time estimate very accurately, and that the instrumental time-stamp is correct, then a 195 zero value of the observed minus predicted travel time residual means that our baseline 1D velocity 196 model provides an accurate representation of the geologic structure along these paths. A negative 197 value of this residual would mean that the picked arrival time is before the predicted arrival time, 198 and therefore that the seismic waves travel faster along the path than the model predicts. Similarly, a 199 positive value would imply slower rock than the model predicts. If the analyst placed the arrival time 200 estimate too late on the seismogram, this would move the curve up uniformly; this offset would be 201 constant for all hypocenter and origin time estimates. A too-early arrival time estimate would move 202 the curve down uniformly. We have a corresponding curve for every event in our dataset for which a 203 first P-arrival at station D25K has been picked: potentially several thousand such curves. The travel 204 time prediction correction for this phase and station combination, as part of the final joint probability 205 distribution, would consider all the curves generated. A timing error on the station would lift the Pand S- time residuals for the station up or down by the same amount. It is important to note that the 206 207 earthquakes relocated in these two sequences occurred over time-intervals of many months (see 208 Ruppert and West, 2020, for details). A timing error typically covers a limited time-span, or is very 209 variable with time, and would likely be detected.

At the very start of the Bayesloc run, the time-residual in Figure 4b) takes on extreme values (often greatly exceeding the actual travel time from the true event location to the station) as the trial hypocenters and origin times for the event lie far from the true values. Few iterations pass before epicenter estimates begin to stabilize in the region of the map where the blue dots in Figure 4a) are observed. The time-residuals in Figure 4b) oscillate around a mean value of around

215 -0.8 seconds. At iteration 1000, corrections to model-based travel time predictions are activated

within Bayesloc. At this point, a rapid change in the evolution of this travel time-residual is observed,

- 217 decreasing to around -2 seconds. The corresponding trial hypocenters move northeast. A more
- 218 negative observed minus predicted time-residual means that the seismic wavefront is travelling
- 219 further than the basis model expects in a given time, and the event hypocenter moves further away

220 from the station to accommodate this. The time-residuals for stations in other locations will evolve in

221 different ways. Over the next 9000 iterations, the D25K-P time-residual continues to decrease but

flattens off to a value of around -2.8 seconds. Note that the spread of time-residual estimates for

223 different trial hypocenters and origin times does not appear to decrease further. Similarly, the cloud

of trial hypocenters for the later iterations (the red dots in Figure 4a) cover an elliptical region about

4 by 7 km, elongated in a direction with a NNE strike. The size of this ellipse, together with the spread

in the time-residuals, provide a visual uncertainty estimate for the event displayed.

Figure 4b) displays the time-residual for the one event for every single trial hypocenter and origin

time. The most typically used parameters from Bayesloc output are the mean values for latitude,

longitude, depth, and origin time (once the so-called burn-in phase, in which the location estimates

230 may be qualitatively different to the end solutions, is removed). In Figure 5, we instead evaluate the

time-residual for mean hypocenter and origin time for each event for the six station-phase

232 combinations indicated. This plot indicates both the internal consistency within the aftershock zone

of the travel time residual for a given phase, and how the values vary from station to station. We see

in Figure 5e) that the large negative time residual we converge towards in Figure 4b) is typical for

almost all events in the cluster and would confirm the hypothesis of fast crust to the southwest of

the aftershock zone. The consistency of this residual term over the full population of events, covering

237 many months, essentially eliminates the hypothesis of a timing error on the station. The variability of

238 S-wave travel time residuals is generally somewhat higher than for P-wave travel time residuals. This

is likely related to the increased difficulty in picking the arrival time for the secondary phases.

The output from Bayesloc provides uncertainty statistics for the hypocenter distributions both
laterally and in depth. The median over Kaktovik events of the standard deviation for location in the
East-West direction was 4.2 km, while the median standard deviation in the North-South direction
was 6.2 km. This is consistent with the distribution of trial hypocenters displayed for the event in
Figure 4 and is a function of the network geometry. The median standard deviation in the depth was
3.8 km and the median standard deviation in the origin time was 0.65 seconds. The travel time from
hypocenter to station has a trade-off with depth and the travel time residuals, as displayed in Figure

5, are relatively insensitive to depth.

248 We focus here on the three closest stations to the aftershock zone to give maximum insight into the 249 northeasterly shift of the hypocenters. The Bayesloc solutions include all arrivals used in the AEC 250 catalog and therefore many hundreds of stations at far larger distances; the time-residuals further 251 from the source will be discussed later. The parallel calculation using a different baseline 1D velocity 252 model is a valuable check on robustness of the hypocenters. We increase the confidence in the 253 spatial distribution of hypocenters obtained if essentially the same distribution is obtained using a 254 somewhat different set of travel time tables; if the solution is robust, the solutions obtained from the 255 different baseline models should differ primarily only in the correction terms to travel time predictions. We note also that only stations within regional distances are used in the AEC bulletin. 256 Given the magnitude distribution of the Kaktovik events (Ruppert and West, 2020) there are many 257 258 aftershocks that will be well recorded with good global coverage at teleseismic distances. Teleseismic 259 travel times are less susceptible to crustal heterogeneity (e.g. Myers et al., 2015) and augmenting the 260 bulletin with high quality teleseismic phases, with a wide azimuthal distribution, for the largest events may provide additional constraints and reduce the sensitivity of the hypocenters to local 261 262 geologic heterogeneity.

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THE 2018/2019 EASTERN BROOKS RANGE EARTHQUAKE SWARM

To the southwest of the aftershock zone considered in the previous sections is a distinct earthquake 265 266 swarm, referred to by Gaudreau et al. (2019) as the Niviak cluster. Ruppert and West (2020) describe 267 the temporal and magnitude distributions of both sequences; the Niviak cluster consists only of 268 events below magnitude 4.5 but is more enigmatic given the spatial distribution, the long duration, 269 and the absence of a causative mainshock. The swarm intensified in July 2018 (shortly prior to the 270 large Kaktovik earthquakes and their aftershocks), reached a peak in October 2018, before 271 decreasing over the fall of 2018. A new intensification of seismicity started in July/August 2019. 272 Figure 6a) displays the locations of the events throughout 2018 and 2019 from the AEC bulletin. We 273 have better azimuthal coverage for recording this swarm than for the Kaktovik earthquakes, with multiple stations observing the sequence in all directions. This is especially true to the north where 274 275 the Kaktovik sequence relied on a single station, C26K. Bayesloc was run using the same arrivals as 276 were used to compile the AEC catalog; the results are displayed in Figure 6b). The large-scale 277 features are unchanged although many features can be identified which appear better resolved or 278 more cleanly separated in the multiple event location estimates. The most south easterly cluster at 279 68.55°N, -145.5°E becomes significantly more compact in the relocations. A double cluster in the AEC 280 network solutions at 68.8°N, -148.2°E resolves into two distinct clusters elongated in the direction of 281 the topographic features. The cluster at 69.2°N, -147.5°E migrates a few kilometers to the northwest 282 and appears to split into two; the change is easier to identify in Figure 6c) where the relocated event 283 positions are superimposed on top of the network solutions. The spatial separation between each of 284 the clusters in the northeast is a little more pronounced in the relocations than in the AEC catalog. 285 Given the fine structures and complex cluster patterns visible in the relocations, there is motivation 286 to perform full-waveform cluster analysis using cross-correlation or other signal semblance analysis. 287 A given arrival measurement can contribute to a location error in two ways: error in travel time 288 prediction and error in the arrival time measurement. Bayesloc mitigates the first of these in a way

that event-by-event network solutions cannot, although we are still only using analyst arrival picks in

290 this study and are still vulnerable to the uncertainty in the human-estimated arrival times. Using

- relative time-delay measurements and double-difference location methods (e.g. Shearer, 1997;
- 292 Waldhauser and Ellsworth, 2000) may reveal geometrical structure at finer spatial scales not
- 293 resolvable using only absolute arrival time estimates; such a study is however beyond the scope of
- this paper. Given that the maximum event magnitude is below 4.5, we are unlikely to be able to
- 295 exploit teleseismic data to improve location accuracy.

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297 DISCUSSION AND FUTURE PERSPECTIVES

298 We have applied the probabilistic multiple event location algorithm Bayesloc to two seismic 299 sequences in northern Alaska for which most of the phase arrivals were provided by stations of the 300 EarthScope USArray Transportable Array. In the first, aftershocks of the 12 August 2018 Kaktovik 301 earthquakes, Bayesloc made a small but significant relocation of the entire cluster. The relocated 302 event cluster has a far sharper southernmost boundary with a strike angle consistent with non-303 seismological constraints on the fault plane. In the second, the Niviak cluster, the probabilistic event 304 locations are significantly more clustered and indicate clearer separation between localized zones of 305 seismicity. Without the TA stations, we would not have the detection threshold or the station 306 coverage to be able to resolve these sequences.

Full-waveform cluster analysis, using correlation methods to measure both signal similarity and enhanced time-delay estimates, is likely to provide improved local scale resolution of the seismicity in both sequences. The feature of Bayesloc which appears to be most powerful in these cases is the ability to solve for corrections to travel time predictions for given paths. The exploitation of readings from multiple events to account for, or to eliminate, bias in travel time estimates is a cornerstone of many advanced seismic event location algorithms (e.g. Douglas, 1967; Richards-Dinger and Shearer, 2000; Nooshiri et al., 2017). The solutions obtained using Bayesloc indicate that failure to account for

anomalously fast propagation to the southwest of the Kaktovik aftershock is the primary reason that

the network locations in many cases lie to the south of the InSAR-inferred fault line.

316 In Figure 5 we display spatially consistent time-residuals for P- and S- phases at the three stations closest to the Kaktovik aftershocks. In Figure 7, instead of a single travel time residual per event for a 317 318 given phase, we display the median travel-time residual for all events in the Kaktovik sequence for P-319 and S- arrivals at each station. The blue symbols to the southwest of the earthquakes (the yellow 320 square) are of similar colors to the symbols in panels e) and f) of Figure 5 and indicate the faster 321 propagation along these paths. It should be noted that the geological heterogeneity over this short 322 path is not necessarily more extreme than elsewhere in Alaska. The waves arriving at more distant 323 stations from the Kaktovik earthquakes have travelled longer paths over which the contribution to the travel time from regions with anomalously fast propagation will cancel with the contributions 324 325 from regions with anomalously slow propagation. 326 The travel time residuals displayed in Figure 7 are relative to one specific 1-dimensional velocity

327 model. However, the location calculations were repeated using alternative velocity models and we 328 confirm that the large-scale features of the relocated clusters of seismicity are largely unchanged. 329 The travel time residual plots for AK135 (corresponding to Figures 5 and 7) look somewhat different 330 as different corrections are required to compensate for the deficiencies of the baseline model along 331 the different paths. Relative insensitivity to the details of the underlying 1-D model was also 332 demonstrated by Gibbons et al. (2017). Another feature of Figure 7 that increases our confidence 333 that the residuals are related to 3-dimensional geologic properties and not a simple inapplicability of 334 the underlying 1D model is the distribution of high positive P-wave time-residuals for stations to the 335 south of the map. The size of the residuals does not increase simply with distance from the source; 336 the highest residuals are found to the South of the Chugach Mountains and indicate slow

337 propagation along these specific paths.

Repeating the procedure applied here to clusters of seismicity across Alaska would generate 338 339 corresponding maps which could be used to validate existing 3-dimensional tomographic images and 340 provide input for large scale evaluations of 3-d velocity maps. Similar studies have been performed 341 both globally and regionally (e.g. Myers et al., 2011, and Simmons et al., 2012) and applying such a procedure to Alaska now would benefit from the recently improved station coverage. There is no 342 limit, in principle, as to how large the datasets for the Bayesloc program can be. In practice, the 343 344 computational cost of calculating the joint probability distributions increases greatly with the number 345 of events and phases; the 40000-iteration calculation for the Kaktovik aftershock sequence with 4192 346 events and 109905 phases took approximately 11.5 hours on a high-end Linux workstation. Simply 347 covering all historical seismicity over all of Alaska and adding new events with all readings as they 348 occur is not a viable strategy for near real-time event location with current technology. Bayesloc, 349 however, can take prior information regarding both uncertainty in event hypocenters and origin times and travel time predictions; results from previous runs can be used to constrain subsequent 350 351 runs without needing to include all the raw inputs. Whereas only a subset of Alaska TA stations will 352 be transitioned into longer-term operation, the contribution of any of the TA stations that are 353 removed will always be valuable in the framework of probabilistic multiple event location algorithms.

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- 366

367 DATA AND RESOURCES

- 368 All maps generated by the GMT package, Wessel and Smith (1995) (Generic Mapping Tool:
- 369 https://www.soest.hawaii.edu/gmt/). (last accessed June 6, 2020)
- 370 Original earthquake hypocenters and phase picks are from the Alaska Earthquake Center Catalog.
- 371 Earthquake relocations were performed using the Bayesloc program, available for download from
- 372 <u>https://www-gs.llnl.gov/nuclear-threat-reduction/nuclear-explosion-monitoring/bayesloc</u>
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- The website of the EarthScope USArray is <u>www.usarray.org</u> (last accessed June 6, 2020)
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466 **Figure Captions**

Figure 1 Subset of the earthquake catalog from the Alaska Earthquake Center (2017-2019)
including the aftershocks of the 12 August 2018 Kaktovik sequence and the 2018 Eastern Brooks
Range swarm together with the closest available stations. BMAR is the Burnt Mountain seismic
array, consisting of 5 short-period vertical component seismometers within an aperture of
approximately 5 km. The M_w 6.0 and M_w 6.4 earthquakes on 12 August 2018 are marked with five
and six-sided polygons respectively.

473

Figure 2 All events in the catalog of the Alaska Earthquake Center for the region displayed in the 474 475 time period 2018-2019 (a) as reported in the AEC catalog, (b) as relocated by Bayesloc using only the arrival picks from the AEC catalog, and (c) with the relocated hypocenters plotted over the 476 477 catalog hypocenters with the same color scales. The symbols in (d) are drawn at the locations of 478 the relocated hypocenters with a color indicating the direction from the relocated epicenter to the 479 catalog epicenter. The blue colors indicate that the catalog locations for almost all events lie to the 480 southwest of the relocated events. The M_w 6.0 and M_w 6.4 earthquakes on 12 August 2018 are 481 marked with five and six-sided polygons respectively. In panel c) the catalog location of the $M_w 6.0$ earthquake is marked with a black pentagon outline. The white lines in panels a), b) and c) indicate 482 483 the surface projections of the InSAR-modelled buried fault segments from Gaudreau et al. (2019).

484

Figure 3 Relocation vectors for all events displayed in Figure 2. We define the catalog location of
each event to be at the origin and plot the relocated hypocenter relative to the catalog
hypocenter. Size of the symbol is proportional to the event magnitude. The M_w 6.0 and M_w 6.4
earthquakes on 12 August 2018 are marked with five and six-sided polygons respectively.

489

- 490 Figure 4 Evolution of the location estimate for a single earthquake in the sequence as a function of
- 491 iteration number in the Monte Carlo Markov Chains of the Bayesloc program. The white symbols in
- 492 panel (a) display the mean epicenters for all events in the sequence and the small colored symbols
- 493 indicate the epicenter location for event 6155 colored according to the iteration. Panel (b) displays
- 494 the observed minus predicted travel time residual with respect to the 1D velocity model for the
- 495 first P-arrival at station D25K. The M_w 6.0 and M_w 6.4 earthquakes on 12 August 2018 are marked
- 496 with five and six-sided polygons respectively.

497

- 498 Figure 5 Observed minus predicted travel time residuals for relocated events in the Kaktovik
- 499 sequence for C26K P-phase (a), C26K S (b), C27K P (c), C27K S (d), D25K P (e), and D25K S (f) relative
- 500 to the 1D velocity model used to locate the events. The M_w 6.0 and M_w 6.4 earthquakes on 12

501 August 2018 are marked with five and six-sided polygons respectively.

502

- Figure 6 Locations of earthquakes in the Eastern Brooks Range swarm (a) from the catalog of the
 Alaska Earthquake Center, (b) from the Bayesloc relocations, and (c) with the two sets of
- 505 hypocenters superimposed with the same color code.

506

Figure 7 Median observed minus predicted travel time residuals for first P (a) and first S (b) arrivals from events in the Kaktovik aftershock sequence given the hypocenters and origin times from the Bayesloc relocation. Blue symbols indicate an earlier than predicted arrival and red symbols indicate a later than predicted arrival. The yellow square indicates the location of the largest earthquake on 12 August 2018. A symbol indicates that the phase and station combination appeared in the catalog of the Alaska Earthquake Center for at least 25 events in the sequence.

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-146°

-145°

-144°

-146°

-145°

-144°

































b)

