

The Global River Width Algorithm

Dai Yamazaki

School of Geographical Sciences, University of Bristol
Dai.Yamazaki@bristol.ac.uk

Note:

This document describes the Global River Width Algorithm (GRW Algorithm), which was used to develop the Global Width Database for Large Rivers (GWD-LR) [Yamazaki et al., in 2014]. The Fortran90 code of the GRWA with sample dataset is available on request to the developer (Dai Yamazaki).

1. Input and Output Datasets

1.1 Input Datasets

The GRW algorithm requires three input datasets: (1) a water body mask; (2) a flow direction map; and (3) a drainage area map. These three input datasets should be prepared in a consistent grid coordination system and at the same spatial resolution. The SRTM Water Body Data (SWBD) [NASA/NGA, 2003] and HydroSHEDS flow direction map [Lerner et al., 2013] are used as the input datasets to develop GWD-LR.

The water body mask describes whether each pixel is a land pixel (value: 0) or a water body pixel (value: 1). Types of water body (i.e. river, lake, ocean) do not have to be distinguished, and all water bodies should be indicated by the value 1 (Figure 1.1).

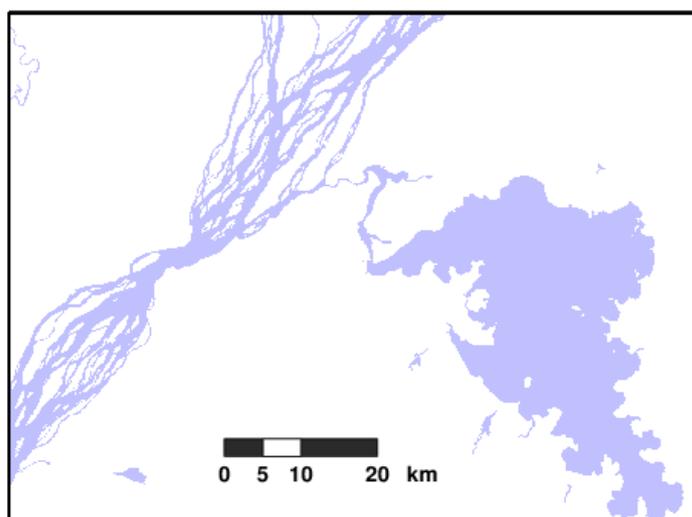
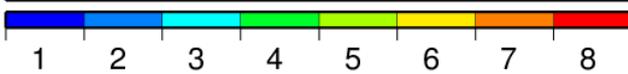
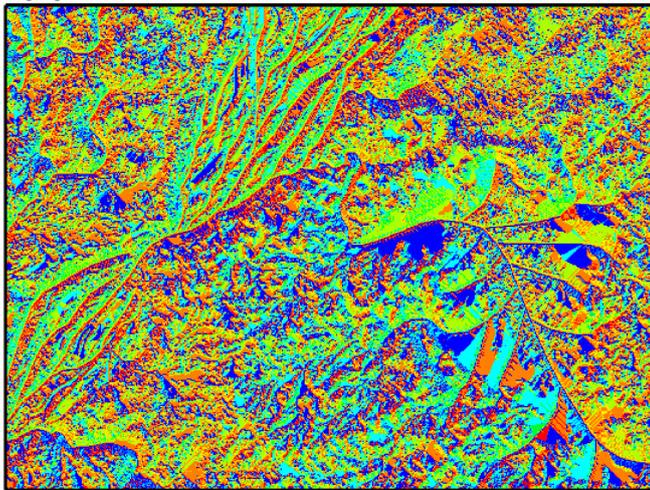


Figure 1.1 Input water body mask. Blue: water body pixels, white: land pixels. A part of the Congo River (17.4-18.2E, 0.4-1.0S) is shown as an example.

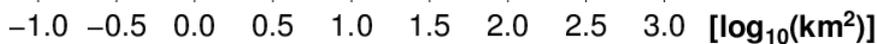
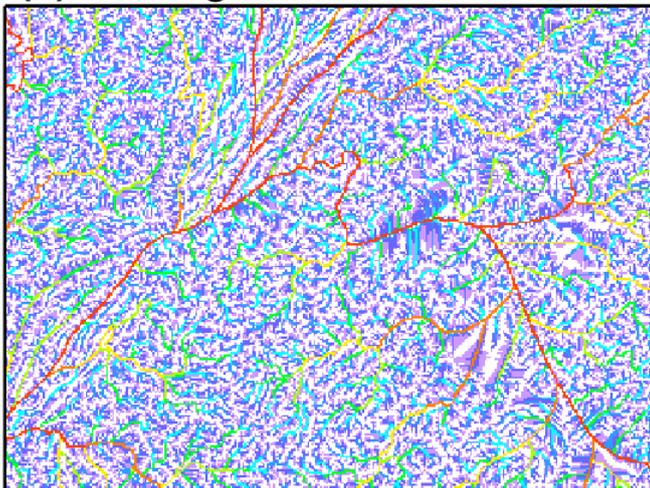
23 The flow direction map describes the downstream direction of surface water flow at each
24 pixel toward one of the eight neighboring pixels (1: north, 2: northeast, 3: east, 4: southeast,
25 5: south, 6: southwest, 7: west, 8: northwest). The river mouth is indicated by the value 0,
26 while ocean pixels are represented by the value -9.

27 The drainage area map (or flow accumulation map) describes the accumulative drainage
28 area of each pixel. The drainage area map can be calculated from the flow direction map.

(a) Flow Direction



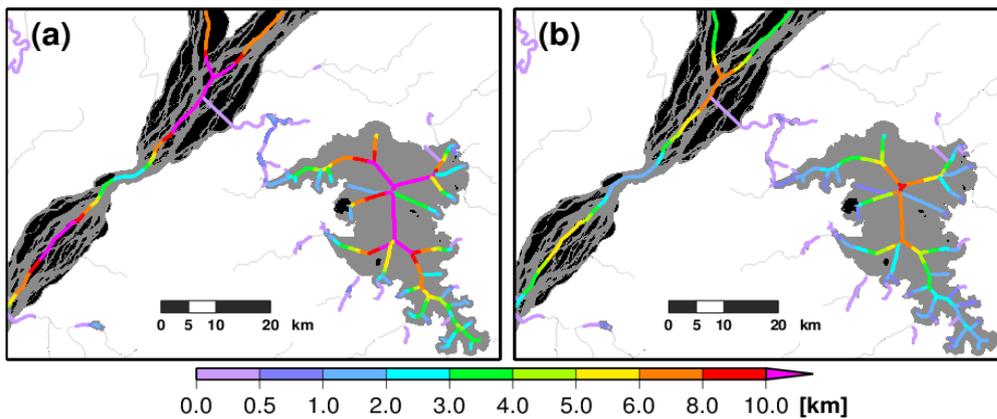
(b) Drainage Area



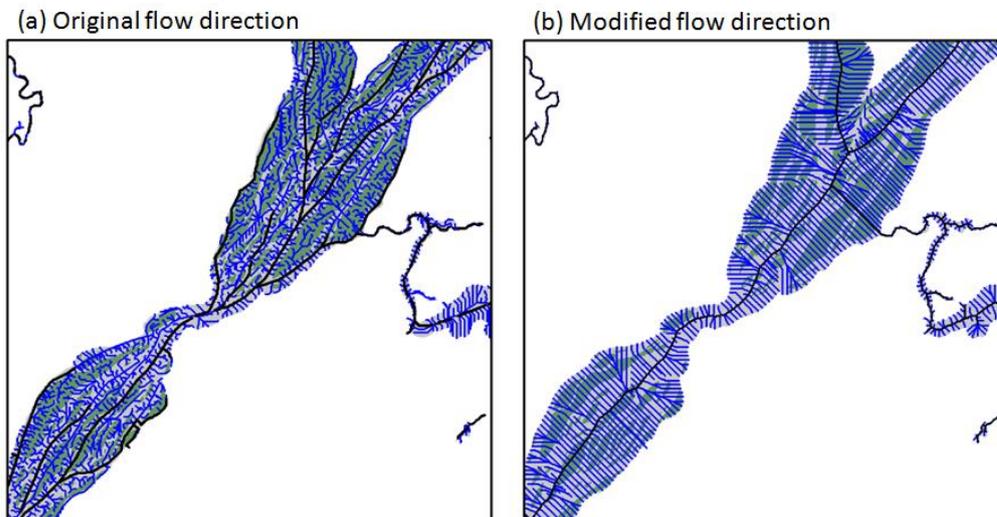
29
30 **Figure 1.2: (a) Input flow direction map (HydroSHEDS). Colors represent flow directions**
31 **(1: north, 2: northeast, 3: east, 4: southeast, 5: south, 6: southwest, 7: west, 8: northwest).**
32 **(b) Input drainage area map.**

33 **1.2 Output Data**

34 The algorithm automatically calculates bank-to-bank river width (Figure 1.3a) and
35 effective river width excluding islands (Figure 1.3b) for all water bodies in the calculation
36 domain. The procedures of the algorithm are explained in Section 2. The modified flow
37 direction map is also outputted as a by-product (Figure 1.4b). The river width is calculated
38 along the modified flow direction map, thus it is straightforward to use the river width
39 database as a topographic parameter of large-scale hydrodynamic models.



40
41 **Figure 1.3: (a) Bank-to-bank river width. (b) Effective river width excluding islands. Water**
42 **bodies are shown gray, while islands are represented by black.**



43
44 **Figure 1.4: (a) Original flow direction map. Major streams are shown by black lines, while**
45 **associated flows are shown by blue lines. (b) Modified flow direction map. Centerline**
46 **pixels (black lines) and perpendicular flows to centerlines (blue lines) are illustrated.**
47 **Islands are represented by dark green. Note that flow directions of limited pixels are**
48 **shown to represent the difference between two panels.**

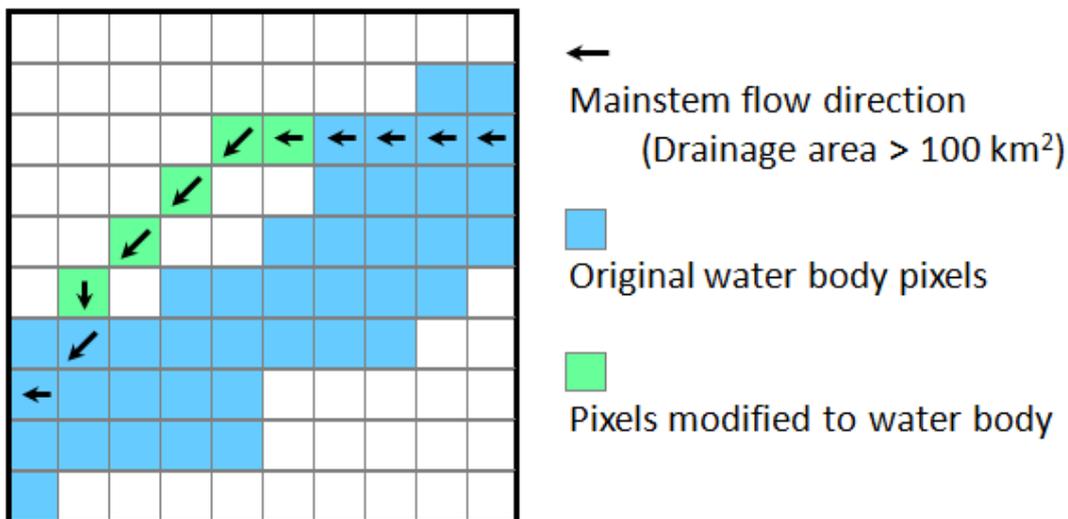
49 **2 Calculation Steps**

50 **2.1 Modification of Water Body Mask**

51 Some modifications of the input water body mask are needed due to discrepancies
52 between the input water body mask and the input flow direction map.

53 [Step 1.1] Pixels whose drainage area is larger than a threshold value (default: 100 km²)
54 are changed to water body pixels. This modification is needed because some rivers in the
55 input flow direction map may run outside of water body areas of the input water body mask
56 (see Figure 2.1).

57 The water body pixels added by this procedure are used for the calculation of
58 bank-to-bank river width, but they are excluded in the calculation of effective river width.

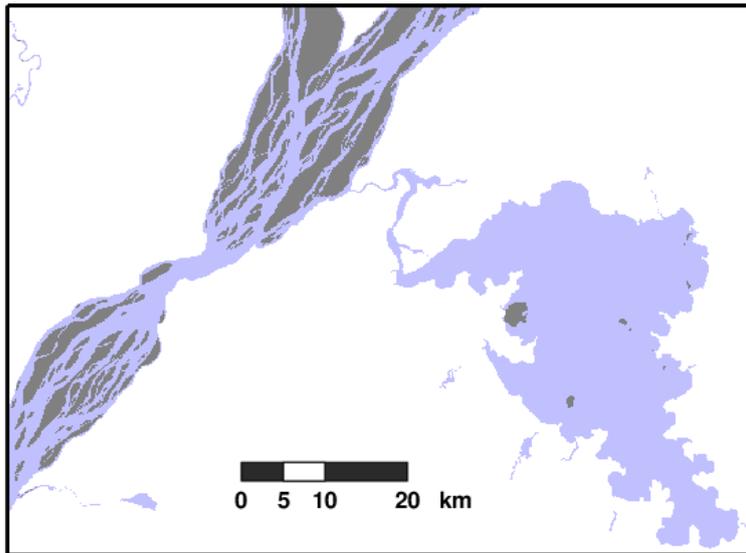


59
60 **Figure 2.1: Water mask modification using drainage area.**

61 [Step 1.2] Gaps between water masks whose area is smaller than the threshold value
62 (default: 1000 km²) are filled as island (Figure 2.2). Water body pixels and island pixels are
63 termed as “in-bank pixels” which are used for the calculation of bank-to-bank river width.

64 Bank-to-bank width is calculated for all in-bank area (water body and island pixels), while
65 island pixels are excluded when effective river width is calculated (see Section 2.10).

66 The default threshold for island filling is set to a relatively large value (1000 km²). All
67 island gaps except for very large ones (e.g. Ilha do Bananal in the Amazon River) are filled
68 by this threshold. This large threshold is used to amalgamate bifurcated channels into one
69 merged channel, because the GWD-LR is mainly developed for application to large-scale
70 river models which cannot represent channel bifurcation.

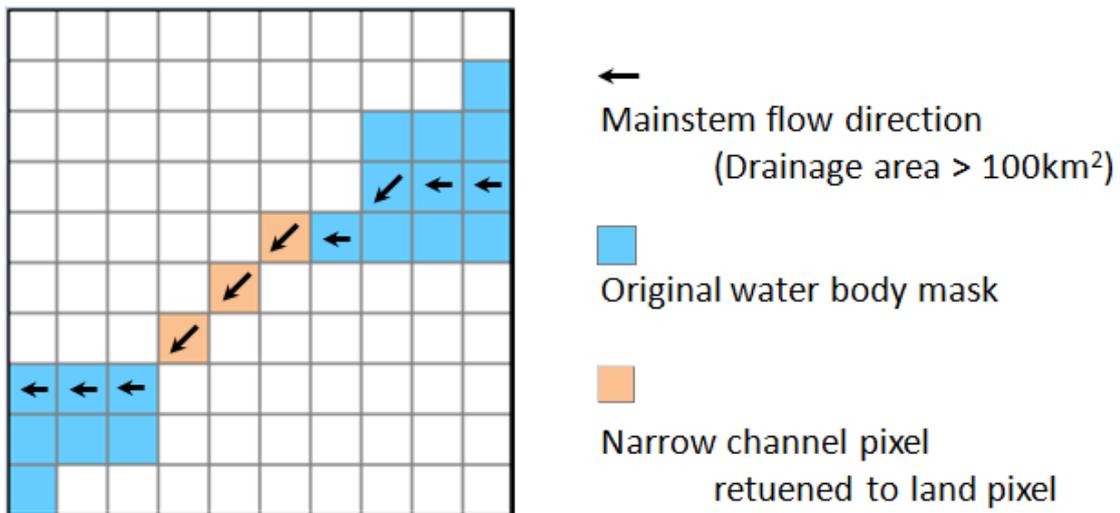


71
 72 **Figure 2.2: Island gap filling.** Gaps in water body mask whose area is smaller than 1000
 73 **km² are filled as island pixels (gray).**

74

75 [Step 1.3] Water body pixels which represent very narrow channels (with 1-pixel width)
 76 are changed to land pixels (Figure 2.3). This modification is applied to improve the
 77 computational efficiency.

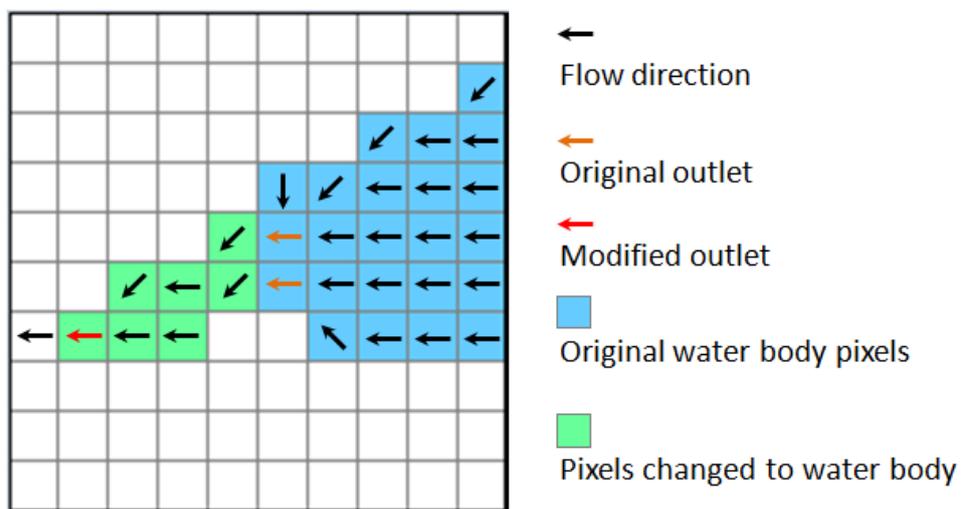
78 Most of these very narrow channels are not represented in the original SWBD water mask,
 79 given that the minimum channel width of the SWBD water mask is 183 m. Thus, most of
 80 them are introduced by the modification in Step 1.1.



81
 82 **Figure 2.3: Narrow channels with 1-pixel width are changed to land pixels.**

83 [Step 1.4] Pixels located within 1 km downstream from water bodies are changed to
 84 water body pixels. This modification is required because it is assumed in the proposed
 85 algorithm that river width is calculated for each “water body unit” which shares one outlet
 86 pixel. If there are multiple outlet from one water body, the water body is treated as multiple
 87 water body units, and river width is calculated separately for each water body unit. The
 88 modification in downstream of a water body generates a shared outlet pixel for each water
 89 body unit (Figure 2.4).

90 The water body pixels added by this procedure are used for the calculation of
 91 bank-to-bank river width, but they are excluded when effective river width is calculated.

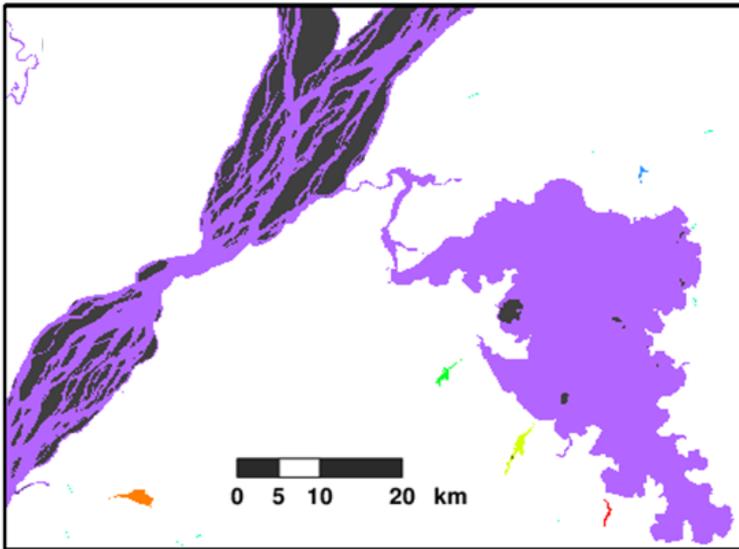


92
 93 **Figure 2.4: Modification on water body downstream.**

94

95 **2.2 Calculation of Water Body unit ID**

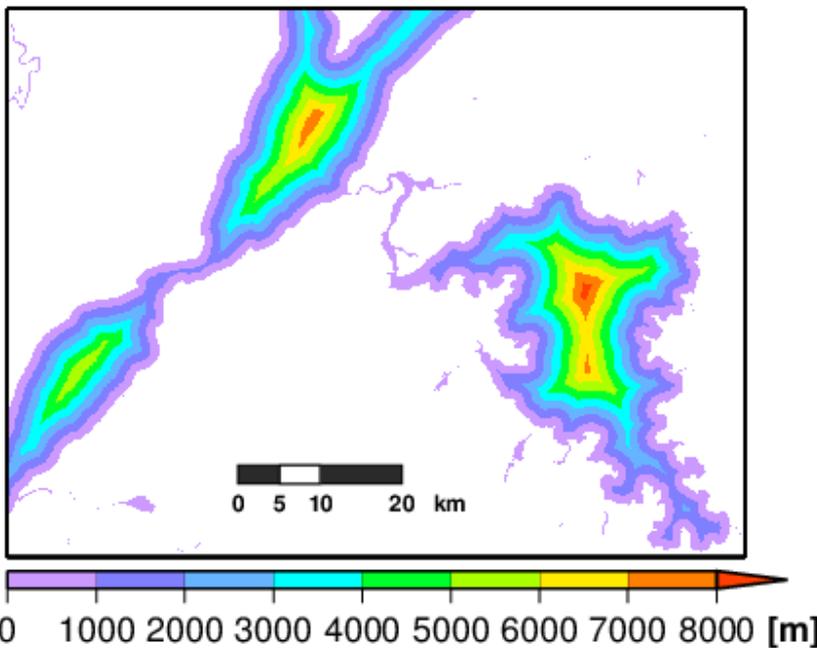
96 [Step 2] Water body and island pixels which share the same water body outlet (a water
 97 body pixel with flow direction toward a land pixel) are treated as one water body unit.
 98 Identical ID number is given to each water body unit.



99
 100 **Figure 2.5: Water body unit ID. Each color represents one water body unit. Island pixels**
 101 **are represented by gray.**

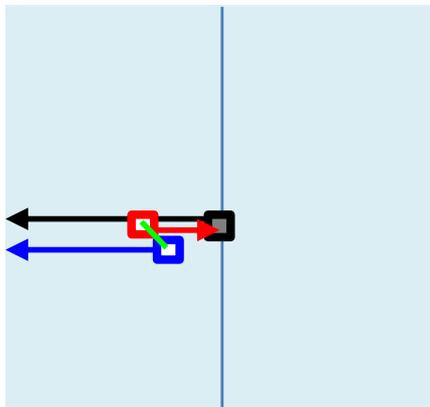
102 **2.3 Calculation of Bank Distance**

103 [Step 3] Bank pixels are identified by searching eight neighboring pixels of each water
 104 body pixel. If any of neighboring pixels is a land pixel, the water body pixels is identified as a
 105 bank pixel. Then, distance to the nearest bank pixel (hereafter “bank distance”) is calculated
 106 for each in-bank pixel (Figure 2.6).



107
 108 **Figure 2.6: Bank distance. Distance to the nearest bank pixel is calculated for each**
 109 **in-bank pixel.**

110 Figure 2.7 is a schematic illustration of the definitions of bank distance, centerline
 111 distance, and local distance between adjacent pixels. The bank distance is given as the
 112 distance to the nearest river bank pixel. The bank distance of the blue squared pixel is given
 113 by the length of blue vector. The centerline distance is given as the normalized distance to
 114 the nearest centerline pixel (explained in Section 2.8). The centerline distance of the red
 115 squared pixel is given by “the length of the red vector divided by the length of the black
 116 vector” (Equation 2.2). The black vector represents the bank distance of the black squared
 117 pixel, which is the nearest centerline pixel of the red squared pixel. The local distance
 118 between the two adjacent pixels (red and green squared pixels) is given by the length of the
 119 green line.



120
 121 **Figure 2.7: Schematic illustration of the definitions of bank distance D_b , centerline**
 122 **distance D_c , and the local distance between adjacent pixels L . The bank distance of the**
 123 **blue squared pixel is given by the length of blue vector. The centerline distance of the red**
 124 **squared pixel is given by “the length of the red vector (geometric centerline distance D_g)**
 125 **divided by the length of the black vector”. The local distance between the two adjacent**
 126 **pixels (red and green squared pixels) is given by the length of the green line.**

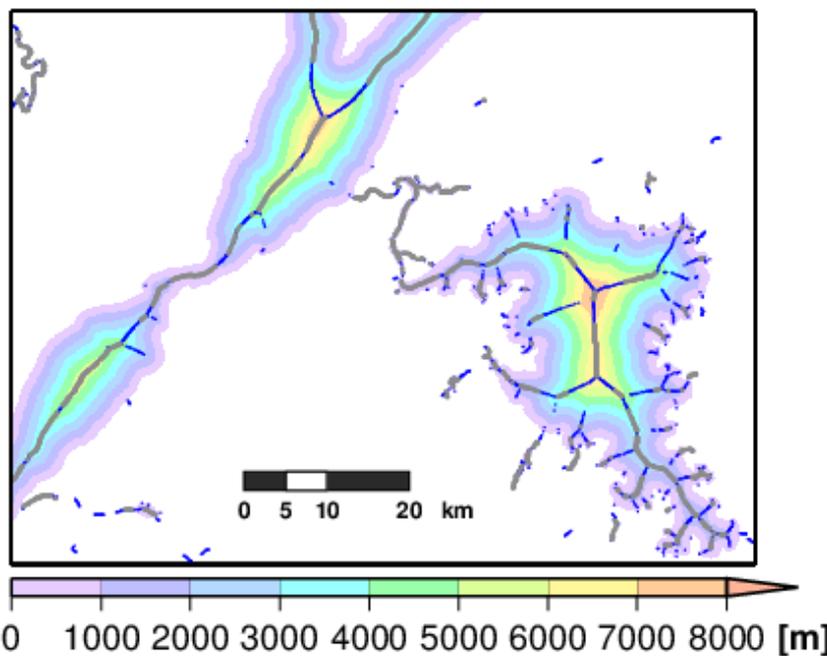
127 2.4 Definition of Centerline Pixels

128 [Step 4.1] Centerline pixels are defined by searching convex points in the bank distance
 129 field. A pixel is judged to be a centerline pixel when the following two conditions are
 130 satisfied: (1) the bank distance of the considered pixel is longer than the bank distance of six
 131 or more neighboring pixels; and (2) the maximum gradient of bank distance between the
 132 considered pixel and its neighboring pixel is not larger than the threshold gradient (set to be
 133 0.26, or $\sim \tan(15^{\text{deg}})$). The gradient of bank distance is calculated by Equation (2.1):

$$134 \quad \Delta D_b / \Delta x = \frac{D_{bj} - D_{bi}}{L} \quad (2.1),$$

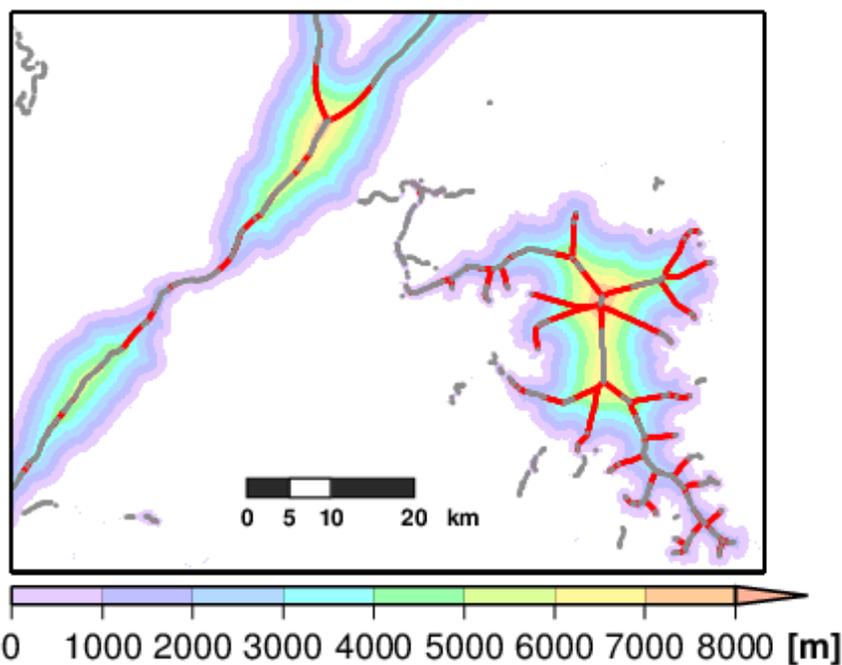
135 where $\Delta D_b/\Delta x$ is the gradient of bank distances, D_{bi} is the bank distance of the
136 considered pixel i , D_{bj} is the bank distance of the neighboring pixel j , and L is the
137 local distance between the centers of the pixels i and j . Note that the distance between
138 two point is calculated as a function of longitude and latitude assuming the earth ellipsoid in
139 this study, so that the difference of actual distance in a degree coordination at different
140 latitude is considered.

141 The first condition was introduced because only the upstream and downstream pixels on
142 the centerline may have a bank distance longer than that of the considered centerline pixel.
143 The second condition was introduced to remove spurious centerlines detected by the first
144 condition. These spurious centerlines are caused by curvatures of river banks (see blue
145 lines in Figure 2.8), and tend to extend from a river bank toward a true centerline. Thus, the
146 gradient of bank distance tends to be larger on a spurious centerline than on a true
147 centerline. The threshold gradient to distinguish true and spurious centerlines was set to be
148 0.26 ($\sim \tan(15^{\text{deg}})$) by trial and error. We found that smaller threshold gradient produces less
149 spurious centerlines, but some true centerlines are not detected when the threshold gradient
150 is too small. The centerline pixels determined by these conditions are shown in gray lines in
151 Figure 2.8, while spurious centerline pixels are shown in blue dots.



152
153 **Figure 2.8: Defining centerline pixels by searching convex points in bank distance field.**
154 **Gray: defined centerline pixels, blue: spurious centerline pixels. The bank distance field**
155 **is shown by the background colors.**

156 [Step 4.2] The centerline pixels detected by Step 4.1 have large gaps between them
157 where river width is increasing because of the second condition. In order to improve the
158 connectivity of centerlines, centerline pixels are extended by the following procedures: (1)
159 for each centerline pixel, the pixel with maximum bank distance among eight neighboring
160 pixels is selected; (2) if the selected neighboring pixel has a larger bank distance than the
161 considered centerline pixel, the selected neighboring pixel is converted to a new centerline
162 pixel; (3) the extension procedure is repeated during the criteria (2) is true. The extended
163 centerline pixels are shown by red lines in Figure 2.9.



164
165 **Figure 2.9: Centerline extension. Gray: original centerline pixels, red: extended centerline**
166 **pixels. The bank distance field is shown by the background colors.**

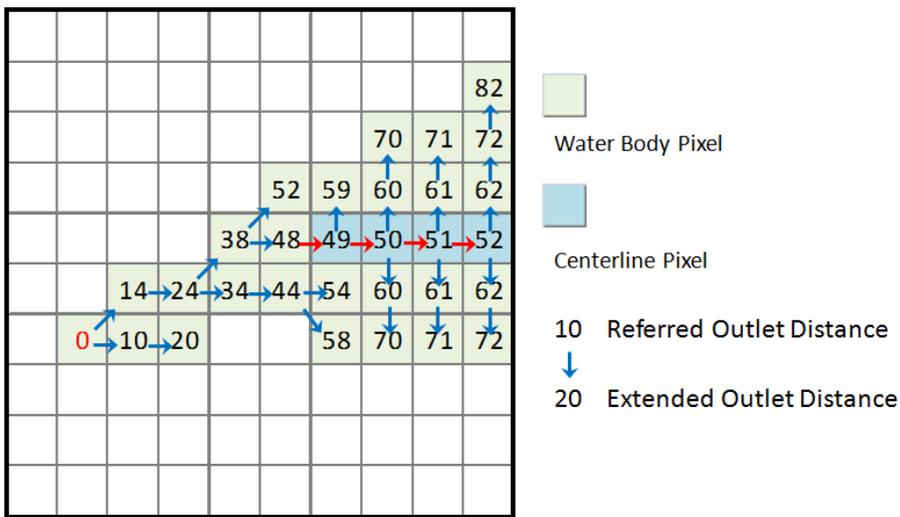
167

168 **2.5 Calculation of Outlet Distance**

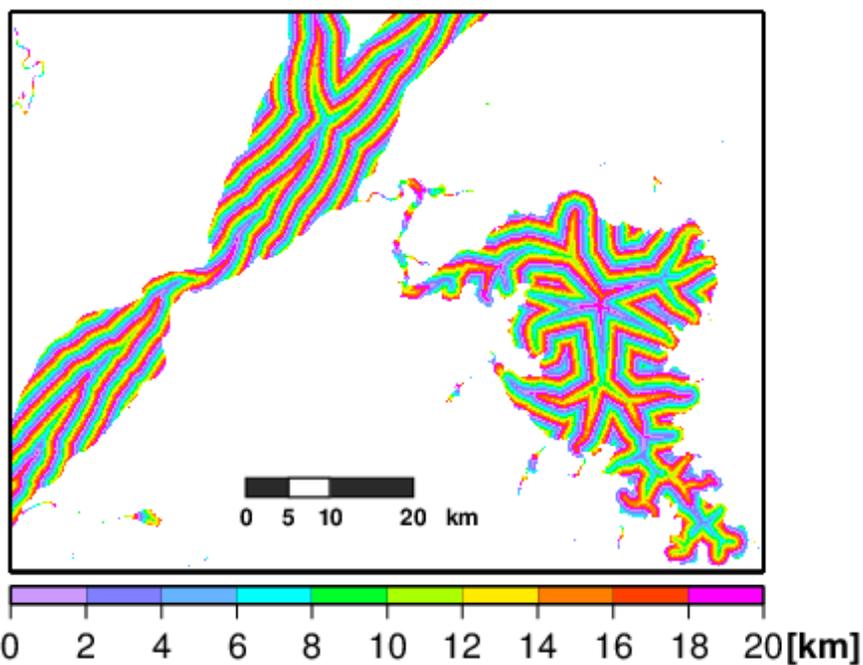
169 [Step 5] The riverline distance from the outlet pixel of each water body unit (hereafter
170 “outlet distance”) is calculated. The outlet distance is calculated by accumulating the local
171 distance between pixels from the outlet pixel toward upstream (Figure 2.10).

172 In order to connect centerline pixels in a sequential downstream direction, the local
173 distance between adjacent pixels is weighted by 10 when the pixel in the upstream side is
174 not a centerline pixel. (blue vectors in Figure 2.10). Sensitivity to this weighing parameter is
175 discussed in Section 3.

176 The calculated outlet distance is shown in Figure 2.11.



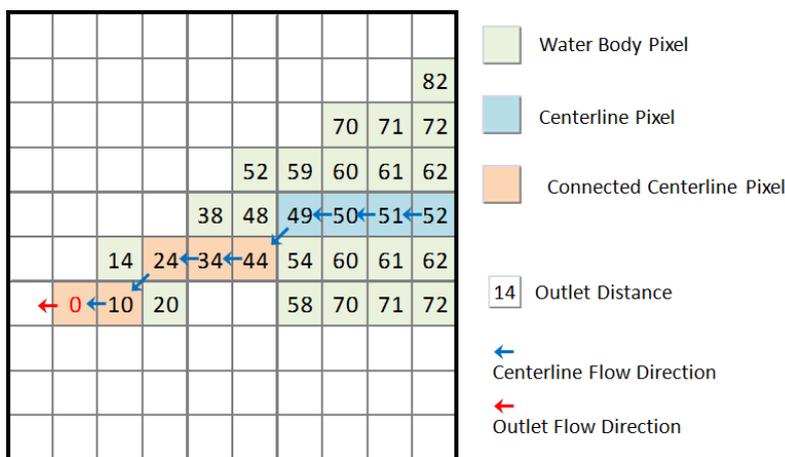
177
 178 **Figure 2.10: Schematic illustration of the outlet distance calculation. The pixel with**
 179 **number 0 denotes the outlet pixel of the water body unit. For easy explanation, the local**
 180 **distance between adjacent pixels in an orthogonal position is set to 1, while the local**
 181 **distance between adjacent pixels in a diagonal position is set to 1.4. The weighted local**
 182 **distances are set to 10 for orthogonal direction and 14 for diagonal direction (blue**
 183 **vectors). The outlet distance is calculated cumulatively from the outlet pixel of a water**
 184 **body unit toward upstream.**



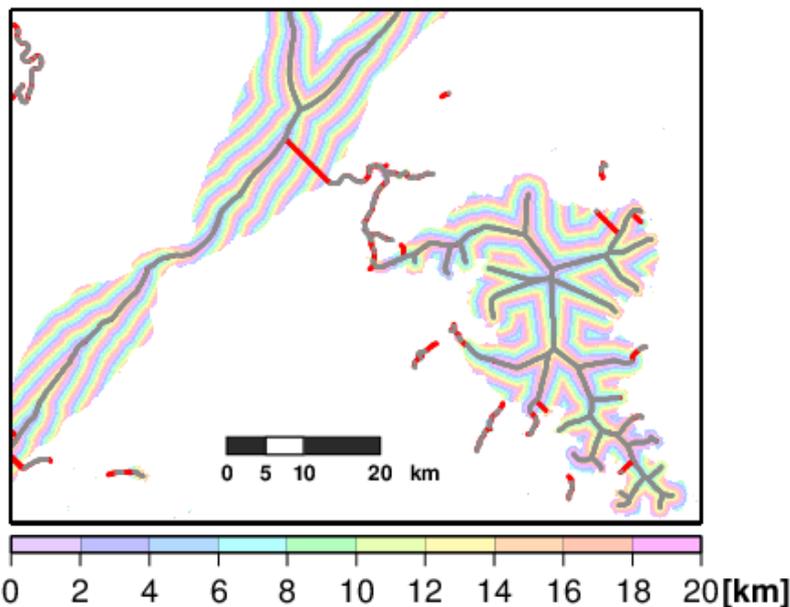
185
 186 **Figure 2.11: Outlet distance. The cumulative riverline distance with weight for**
 187 **non-centerline pixels from the outlet of each water body unit is shown by periodic colors.**

188 **2.6 Setting Centerline Flow Directions**

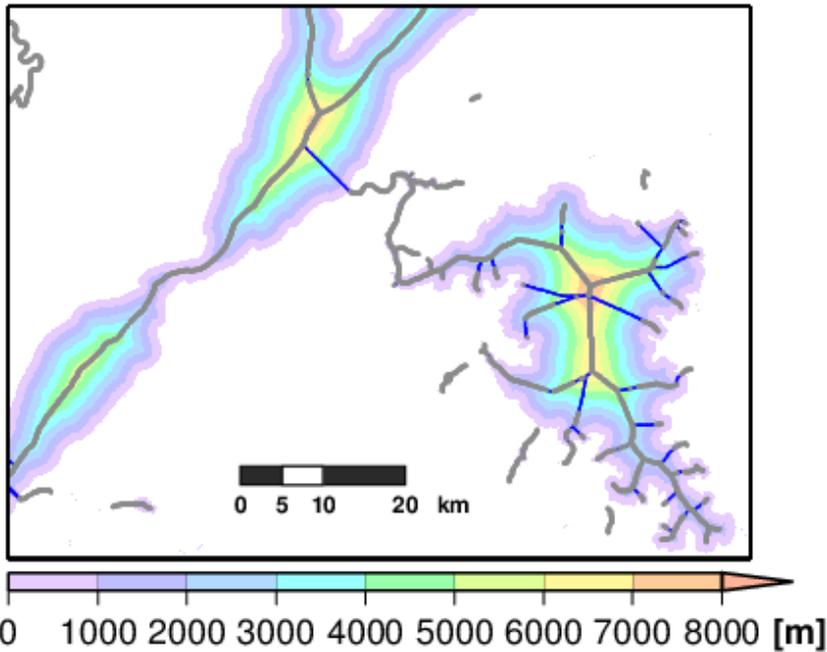
189 [Step 6.1] The downstream direction of each centerline pixel is determined by choosing
 190 the pixel with minimum outlet distance among its eight neighboring pixels (Figure 2.12). If
 191 the selected downstream pixel is not a centerline pixel, the selected downstream pixel is
 192 changed to a new centerline pixel. The centerline extension is repeated until the
 193 downstream centerline pixel or the outlet pixel is connected (connected centerline pixels are
 194 shown by orange boxes in Figure 2.12 and red lines in Figure 2.13). Thus, the connectivity
 195 between all centerline pixels is ensured within a water body unit (Figure 2.13).



196
 197 **Figure 2.12: Determination of centerline flow directions.**



198
 199 **Figure 2.13: Centerline connection. Gray: original centerline pixels, red: connected**
 200 **centerline pixels. The outlet distance field is shown by the background colors.**

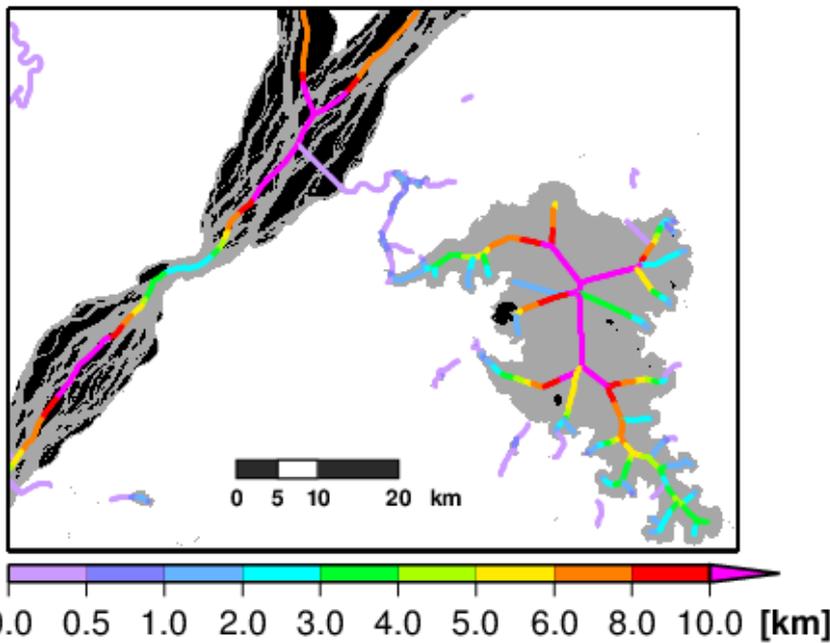


219
220
221

Figure 2.15: Centerline classification. Gray: actual centerline. Blue: virtual connecting centerline. Background color represents bank distance.

222
223
224
225

[Step 7.2] The bank-to-bank river width of actual centerline pixels is set to twice of its bank distance. The bank-to-bank distance of the virtual connecting centerlines (blue lines in Figure 2.15) is set to the same value as the bank-to-bank river width of its nearest upstream actual centerline pixel. The calculated bank-to-bank river width is shown in Figure 2.16.



226
227

Figure 2.16 Bank-to-bank river width. Gray: non-centerline water body. Black: island.

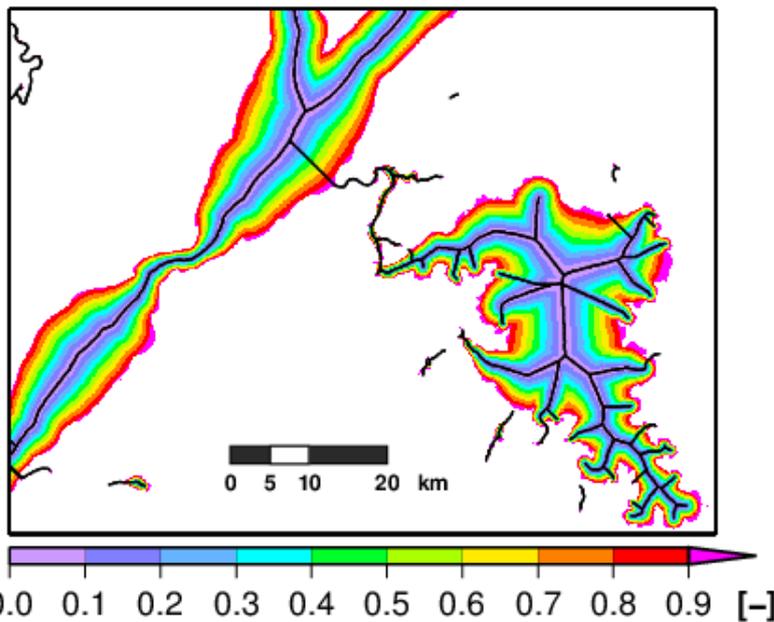
228 **2.8 Calculation of Centerline Distance**

229 [Step 8] For every in-bank pixels, the distance to its nearest centerline pixel (hereafter
230 “centerline distance”) is calculated. Centerline distance is normalized by the bank distance
231 of the nearest centerline pixel in order to avoid unrealistic accumulation of flow from an area
232 outside of a tributary’s width, within the zone where the tributary merges into its main
233 channel (Explained in Section 3.2).

234 The scaled centerline distance is given by Equation (2.2):

235
$$D_c = \frac{D_g}{D_{bc}} \tag{2.2},$$

236 where D_c is the normalized centerline distance, D_g is the geometric distance to the
237 centerline pixel, and D_{bc} is the bank distance of the nearest centerline pixel. The
238 normalized centerline distance of a considered pixel becomes smaller when its nearest
239 centerline pixel has larger bank distance and vice versa. The weighted centerline distance is
240 shown by colors in Figure 2.17.



241 0.0 0.1 0.2 0.3 0.4 0.5 0.6 0.7 0.8 0.9 [-]
242 **Figure 2.17: Centerline distance. The background colors represent centerline distance (i.e.**
243 **normalized distance to its nearest centerline). Centerlines are illustrated by black lines.**

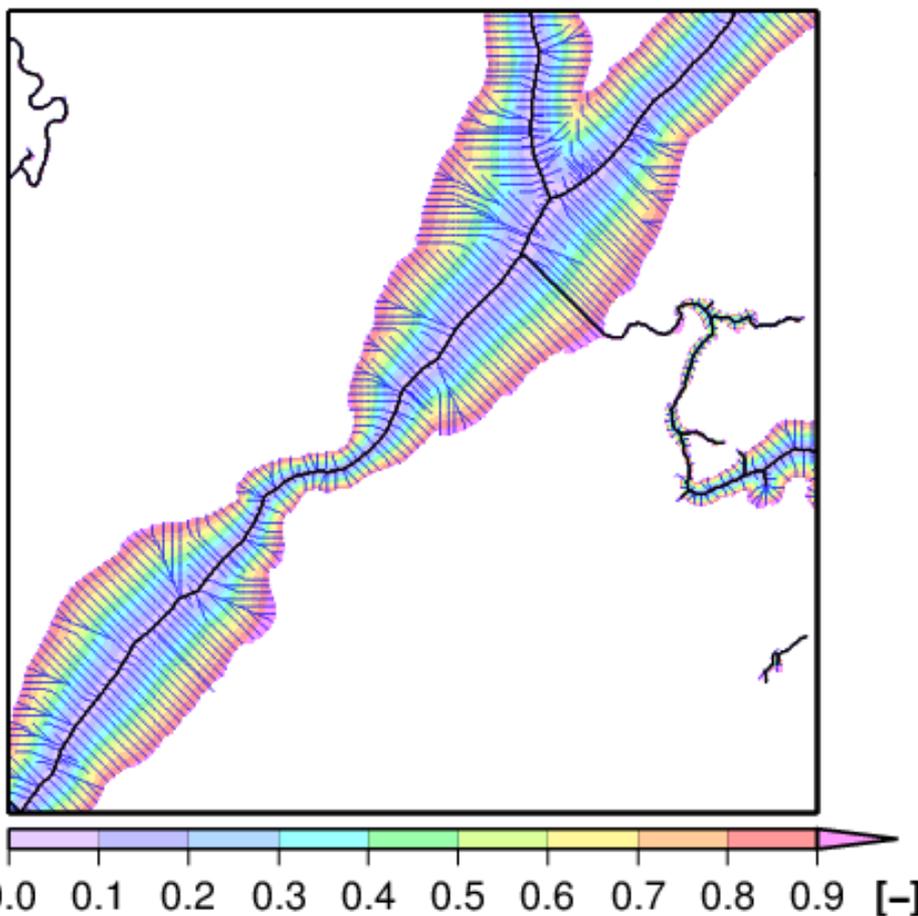
244 **2.9 Determination of flow direction**

245 [Step 9] The flow direction of each non-centerline pixel is decided based on the gradient
246 of centerline distance given by Equation 2.3.

247
$$\Delta D_c / \Delta x = \frac{D_{cj} - D_{ci}}{L} \quad (2.3),$$

248 where $\Delta D_c / \Delta x$ is the gradient of centerline distance, D_{ci} is the centerline distance of
249 the considered pixel i , D_{cj} is the centerline distance of the neighboring pixel j , and L
250 is the local distance between the pixels i and j .

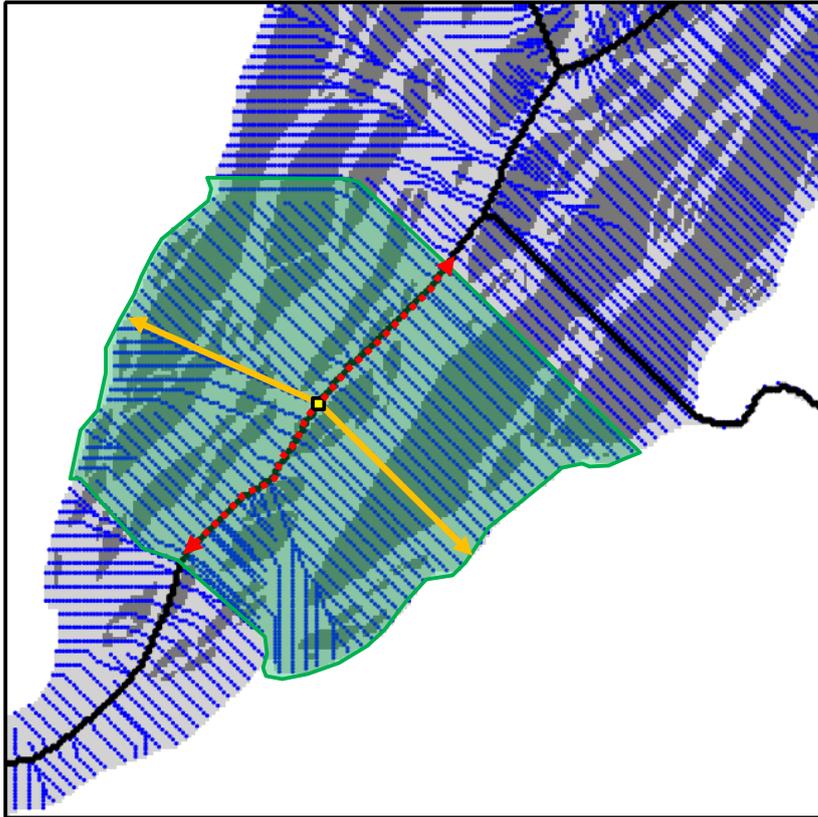
251 Then, the flow direction is determined for each pixel by choosing the maximum gradient
252 among the eight neighboring pixels. The modified flow directions are shown in Figure 2.18.



253 0.0 0.1 0.2 0.3 0.4 0.5 0.6 0.7 0.8 0.9 [-]
254 **Figure 2.18 Calculation of Flow Directions. Flow directions are represented by blue lines**
255 **while centerlines are indicated by black lines. Background colors represent normalized**
256 **centerline distance. Note that flow directions of limited pixels are shown.**

257 **2.10 Calculation of effective river width**

258 [Step 10.1] The effective river segment for each centerline pixel is defined for the
259 calculation of effective river width excluding islands. The effective river segment for a given
260 centerline pixel is defined as; the longitudinal reach within the bank distance length either
261 side of the pixel (the red dashed line in Figure 2.19), and includes the none-centerline pixels
262 draining to that segment of centerline. (the area shaded with green in Figure 2.19).



263
264 **Figure 2.19: Calculation of effective channel segment. The green shaded area represents**
265 **the effective river segment of the centerline pixel marked by the yellow square. The**
266 **dashed red vector represents the effective centerline of the considered centerline pixel,**
267 **which is determined by the bank distance of the considered pixels (orange vectors).**

268
269
270

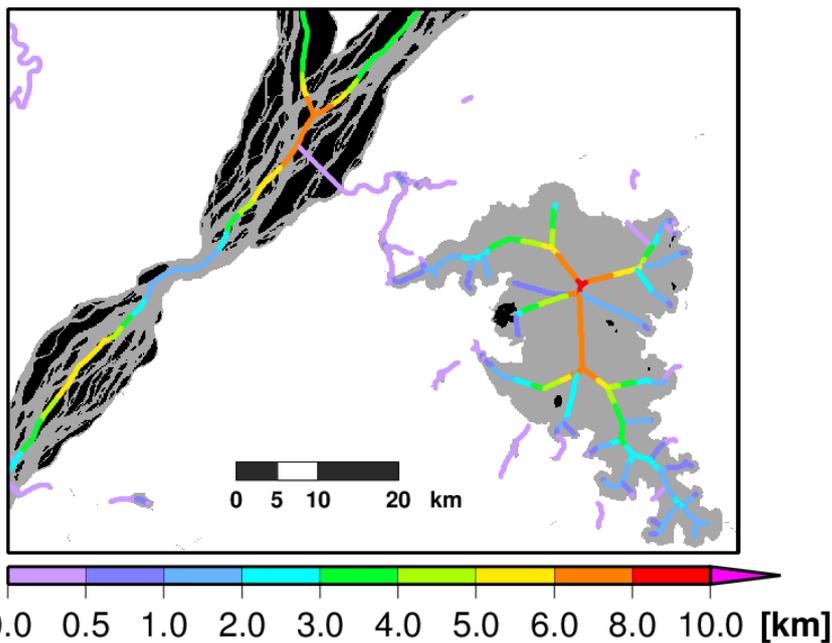
271 [Step 10.2] The total in-water area (water body and island) and the total water body area
 272 within the effective river segment are calculated. Then, effective river width is calculated by
 273 Equation (2.4).

$$274 \quad W_e = W_b \times \left(\frac{A_w}{A_t} \right) \quad (2.4),$$

275 where W_e is the effective river width, W_b is the bank-to-bank river width, A_t is the
 276 total in-water area (i.e. water body and islands), A_w is the total water body area.

277 The effective river width of the virtual connecting centerlines (blue lines in Figure 2.15) is
 278 modified to the same value as the effective river width of its nearest upstream actual
 279 centerline pixel.

280 The calculated effective river width is shown in Figure 2.20.



281 0.0 0.5 1.0 2.0 3.0 4.0 5.0 6.0 8.0 10.0 [km]
 282 **Figure 2.20. Effective river width. Non-centerline water bodies are represented by gray,**
 283 **while islands are represented by black.**

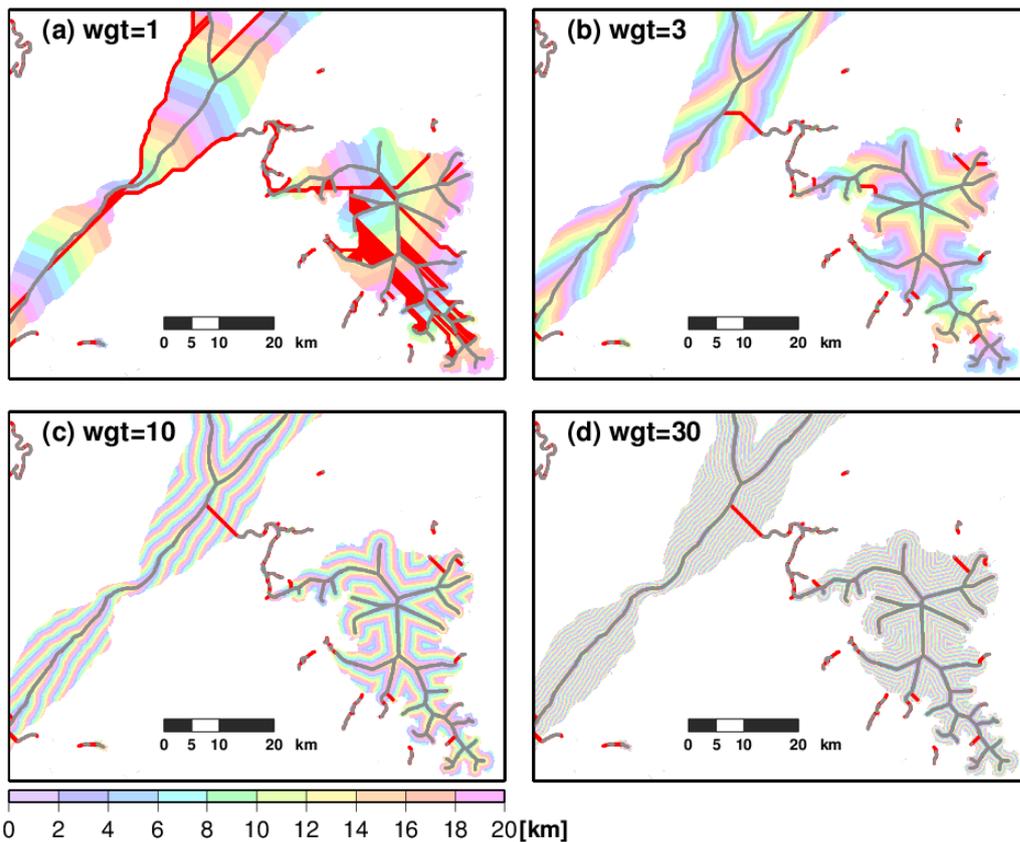
284

285 **3. Sensitivity to Parameters**

286 Sensitivity of the river width calculation to parameters used in the global river width
287 algorithm is discussed in this section.

288 **3.1 Weight for outlet distance**

289 The weight on the outlet distance is introduced to achieve sequential downstream
290 connection of centerline pixels (Section 2.6). If the weight is too small, centerline pixels are
291 not appropriately connected (the weight is set to 1 and 3 in Figures 3.1a and 3.1b,
292 respectively). Intermittent centerlines are preferred to be connected to their nearest
293 downstream centerline, but it's difficult to find the nearest downstream centerline when the
294 weight too small. When the weight is large enough, the result is not sensitive to the weight
295 value (the weight is set to 10 and 30 in Figures 3.1c and 3.1d, respectively). Calculation time
296 becomes longer when a larger weight is used, thus we decided to use the weight of 10.

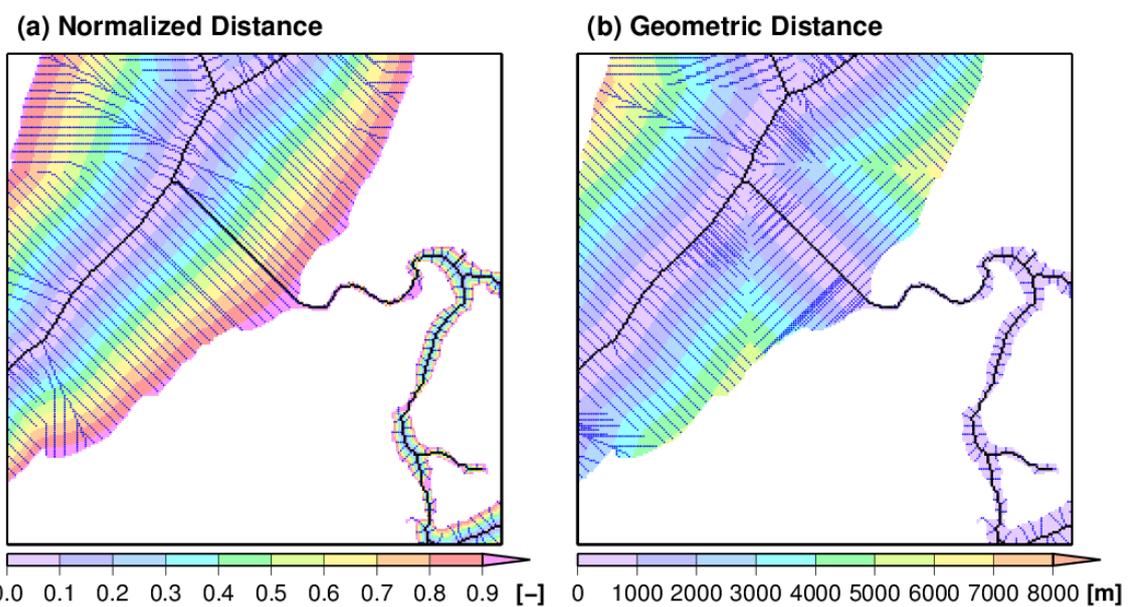


297
298 **Figure 3.1: Sensitivity of centerline connection to the weight on outlet distance**
299 **calculation. The original centerlines calculated from bank distance are shown by gray**
300 **lines, while connected centerlines calculated by outlet distance are shown by red lines.**
301 **Background colors represent outlet distance.**

302 **3.2 Normalized centerline distance**

303 Centerline distance (i.e. distance to the nearest centerline, see Section 2.8) is normalized
304 by the bank distance of the nearest centerline pixel (see, Equation 2.2). The normalization is
305 introduced in order to avoid unrealistic accumulation of flow from an area outside of a
306 tributary's width, within the zone where the tributary merges into its main channel. If
307 centerline distance is not normalized, small tributaries unrealistically gather flows from its
308 main channel (Figure 3.2b).

309



310

311 **Figure 3.2 Modified flow direction derived from (a) normalized centerline distance, and (b)**
312 **geometric (non-normalized) centerline distance. Flow directions are shown by blue lines,**
313 **while centerlines are illustrated by black lines. Background colors represent centerline**
314 **distance.**

315

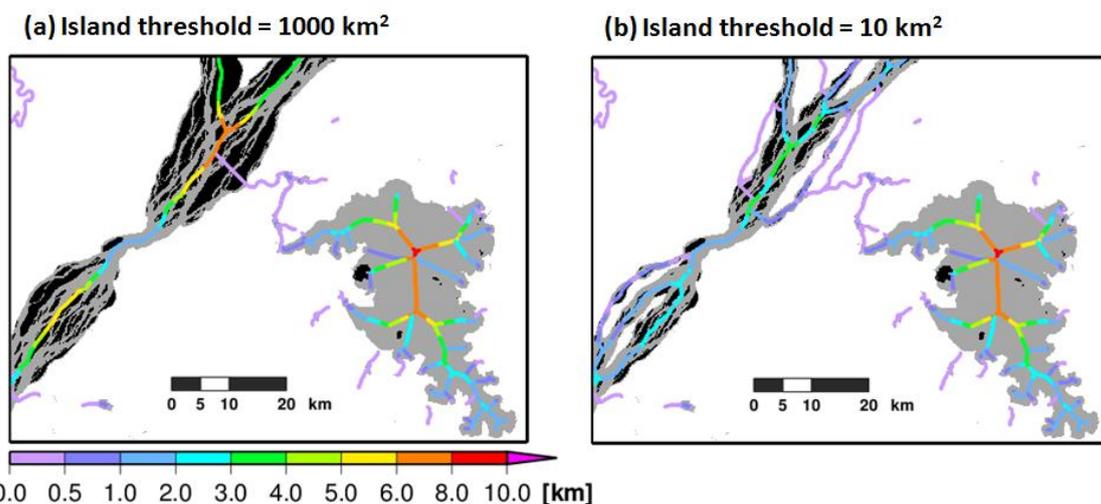
316

317

318 **3.3 Threshold for island gap filling**

319 Relatively large threshold (1000 km²) for island gap filling was used in order to
320 amalgamate bifurcated channels into one merged channel (Figure 3.3a), because the main
321 target of GWD-LR is application to large-scale hydrodynamic models which cannot
322 represent channel bifurcations.

323 In case width values are needed for each bifurcated channels, smaller threshold value for
 324 island gap filling may be preferred. By taking the smaller threshold, effective river width can
 325 be calculated separately for bifurcated channels (Figure 3.3b). Note that accuracy of
 326 effective river width calculation for bifurcated channels depend on the quality of the input
 327 water mask and input flow direction map. Manual correction may be needed because small
 328 channels are generally not well represented both in the water mask and the flow direction
 329 map.



330 0.0 0.5 1.0 2.0 3.0 4.0 5.0 6.0 8.0 10.0 [km]
 331 **Figure 3.3: Effective river width calculated with a different threshold value for island gap**
 332 **filling. (a) 1000 km² threshold, (b) 10 km² threshold. Water masks are shown by gray, while**
 333 **filled islands are shown by black.**

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