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# Assessment of post-tsunami disaster land use/land cover change and potential impact of future sea-level rise to low-lying coastal areas: A case study of Banda Aceh coast of Indonesia

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## Abstract

The objective of this study is to investigate the impact of the projected sea-level rise to the coastal land use/land cover (LULC) at a disaster-prone coastal area, encompassing an engineering time-scale, based on a couple of sea-level rise scenarios. We investigate the Banda Aceh coast, a low-lying coastal area vulnerable to multiple hazards such as tsunamis and co-seismic land subsidence, which is typical along the Indonesian coastlines. Three sets of multi-temporal Google Earth Engine images acquired in 2004 (pre-tsunami December 2004), 2011 and 2017 were utilized to obtain the areal coverage of various types of LULC. The scenarios of coastal inundation were pre-determined at elevation +1.0 m and +1.5 m forecasting the projection of the sea-level rise in the next couple centuries. Aquaculture ponds, buildings and bare land are the top three most pre-dominant land covers in Banda Aceh coast. The finding of this study reveals that the aquaculture ponds are at the highest risk to the future sea-level rise, and potentially contribute to the unproductive swamp area. The bare land which has a huge potential to be converted into settlement area (buildings, housing, etc.), experienced remarkable loss due to both future inundation scenarios. The coastal area of Banda Aceh in the next couple of centuries, thus, will be highly vulnerable to the projected sea-level rise, providing the fast-growing and ever-expanding built environment very close to the coastline. A sustainable coastal management taking into account the disaster risk should, therefore, be incorporated within the decision making for the protection of the coastal area.

*Keywords: sea-level rise, tsunami, land use/land cover (LULC), Remote Sensing, GIS*

## 1. Introduction

Most of the population in the developing countries living in low-lying coastal areas are marginalised in the economy. Poorest people are often the hardest hit by climate change impacts, either because they already live on small lands, such as riverbanks, deforested areas, or floodplains, or because they have the lowest adaptive capacity due to a lack of education,

44 financial resources, physical resources, and/or government support. As a result, a very large  
45 number of people are especially vulnerable to climate change and hydro-meteorological  
46 disasters. Indonesia is the fourth largest populated ~~country~~ and one among the top ten  
47 nations whose population are living in low-lying coastal areas (WOR 1, 2010). Recent trends  
48 in Indonesia show that hydro-meteorological-borne natural disasters are overtaking  
49 geophysical disasters in terms of frequency of occurrences, mortality, and damages. Indonesia's  
50 National Disaster Management Agency (BNPB) reported that 87% of all disasters that occurred  
51 between 1982-2012 were hydro-meteorological disasters in the forms of floods (38%),  
52 landslides (18%), typhoons (18%), droughts (13%), and surges (<1%), which together caused  
53 close to 14,000 human casualties (Sofian, 2010).

54 Given the rate of sea-level rise in the Indonesian waters could reach as high as 0.2 - 0.6 cm/year  
55 according to Intergovernmental Panel on Climate Change (IPCC, 2007), the projected future  
56 inundation of the coastal areas can be in the order of a few meters high by the next couple of  
57 centuries. Analysis and projection of sea-level rise by the Indonesian Climate Change Sectoral  
58 Roadmap (ICCSR) concluded that globally, sea level rise (SLR) is about 3.1 mm/year at  
59 present, while the average sea level rise in the 20<sup>th</sup> century is only 1.7 mm/year (Sofian, 2010).  
60 More than a third of sea level rise is caused by the melting of ice caps in the Greenland and  
61 Antarctica, and by the retreat of glacial ice. Some recent research shows that the melting of  
62 glacial and polar ice will increase as global warming intensifies (Shepherd, *et al.*, 2018; Spada  
63 and Galassi, 2016; Shepherd, *et al.*, 2010). If the warming and the melting of ice continue at a  
64 rate similar to that of the past 5 years, then the predicted sea level rise in 2100 could be as much  
65 as 80 cm to 180 cm (Sofian, 2010). The dynamic of natural processes influenced by ~~the~~ global  
66 climate change and seismicity operating over a few tenth kilometres coastline should, therefore,  
67 be incorporated in order to make a sound management of the coastal areas.

68 In the last decades, research topic on change detection of surficial features of the earth,  
69 including changes of the coastal areas are increasing (Halls *et al.*, 2018; Meilianda *et al.*, 2010;  
70 Muttitanon and Tripathi, 2010; Foody, 2002; Chen, 1998; Weismiller *et al.* 1977). This is in  
71 particular advantaged by the ~~advanced-state-of-the-art technology of~~ remote sensing  
72 technology which offers multi-temporal satellite images as one of the primary data sources to  
73 characterize environmental change (Foody, 2002). Several studies related to change detection  
74 of terrestrial water bodies, such as lake monitoring, watershed or flood events ~~were~~ have been  
75 conducted using multi-temporal moderate resolution Landsat images (Zhu *et al.*, 2015; Taravat  
76 *et al.*, 2016; Rokni *et al.*, 2014; Zheng *et al.*, 2015). Other studies have focused on hydrological  
77 impacts of LULC (Petchprayoon *et al.*, 2010), impacts of LULC cover change and urbanization  
78 on flooding (Zope *et al.*, 2016), or assessment of LULC changes and sea level rise (Balukkarasu  
79 *et al.*, 2016).

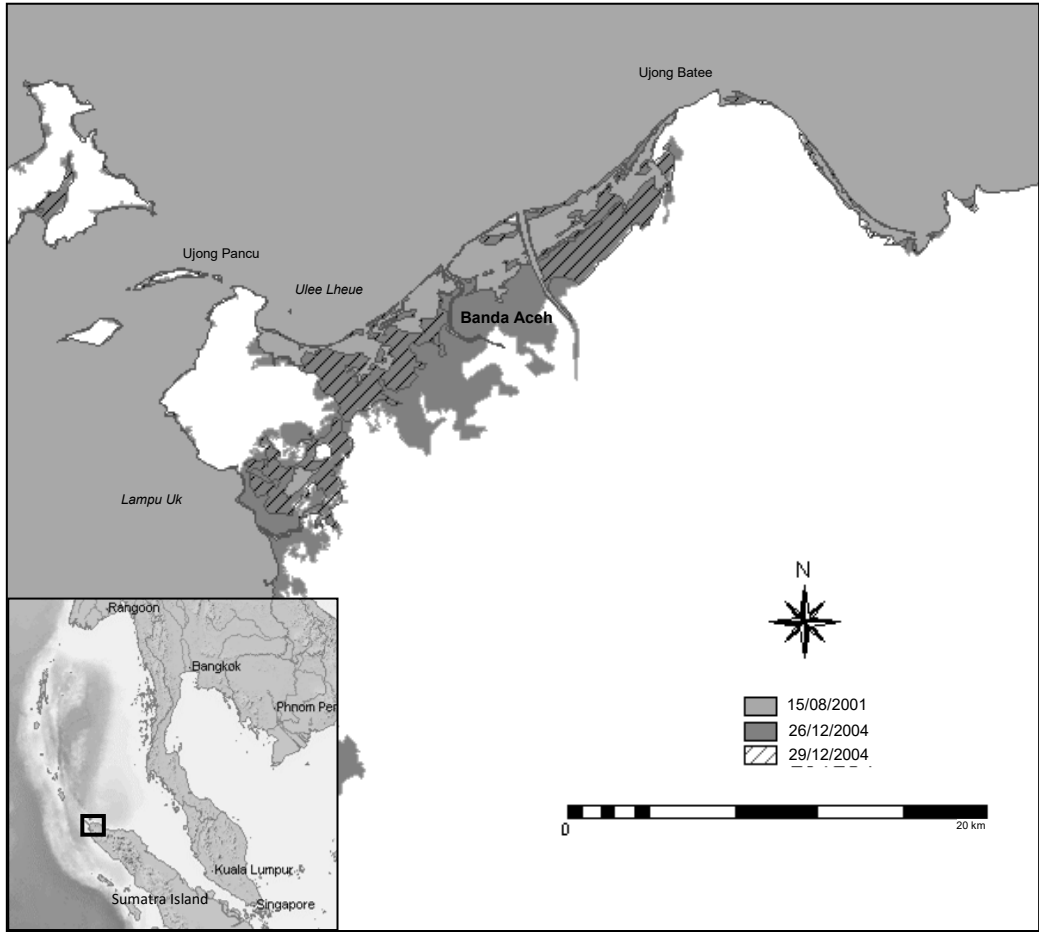
80 The present study assesses the impact of potential sea-level rise induced by climate change to  
81 LULC at a low-lying coastal area that once severely affected by another extreme event, such  
82 as a tsunami. A low-lying coastal area is often vulnerable to multiple hazards. A tsunami event  
83 has its capacity to change the morphological state of a coastal area instantaneously (Meilianda  
84 *et al.*, 2010; Monecke *et al.*, 2015), while a climate-induced sea-level rise may slowly alter the  
85 coastal morphology due to lack of sediment transport capacity so that the coast may constantly  
86 be in non-equilibrium state (Monecke *et al.*, 2017; Cooper and Pilkey 2004; Morton *et al.*,  
87 2004). Future scenarios of how such tsunami-prone coastal area changes, therefore, should

88 address the two parameters to understand the risks the coastal area would face, and then to  
89 formulate comprehensive mitigation measures to reduce those risks.

90 **2. Study area**

91 The coastal area of Banda Aceh, located at the northern tip of Sumatra Island of Indonesia is  
92 selected as the study area. Banda Aceh is the capital city of Aceh Province, situated between  
93 05°16'15"N and 05°36'16"N, and between 95°16'15"E and 95°22'35"E. The coastal city of  
94 approximately 61,36 km<sup>2</sup> is representing a typical low-lying coastal area vulnerable to  
95 multiple hazards such as tsunamis and tectonic land subsidence (Meilianda, *et al*, 2010), and  
96 at the same time is threatened by the increasing intensity of wave surges and coastal flooding,  
97 particularly during the rough monsoon months. The largest outflow crossing the city ~~are~~is  
98 the Krueng Aceh River and the Alue Naga Floodway Canal which dissect the coastline into  
99 three coastal cells. Most parts of the coastal areas which are encroached up to 1 km inland are  
100 low-lying which elevation merely between -0.5 to +1.0 m from the mean sea level. The tidal  
101 range is averagedly less than 1.0 m, which is categorised as micro-tidal. The entire coast is at  
102 the highest risk of potential tsunami hazards (Fig. 1).

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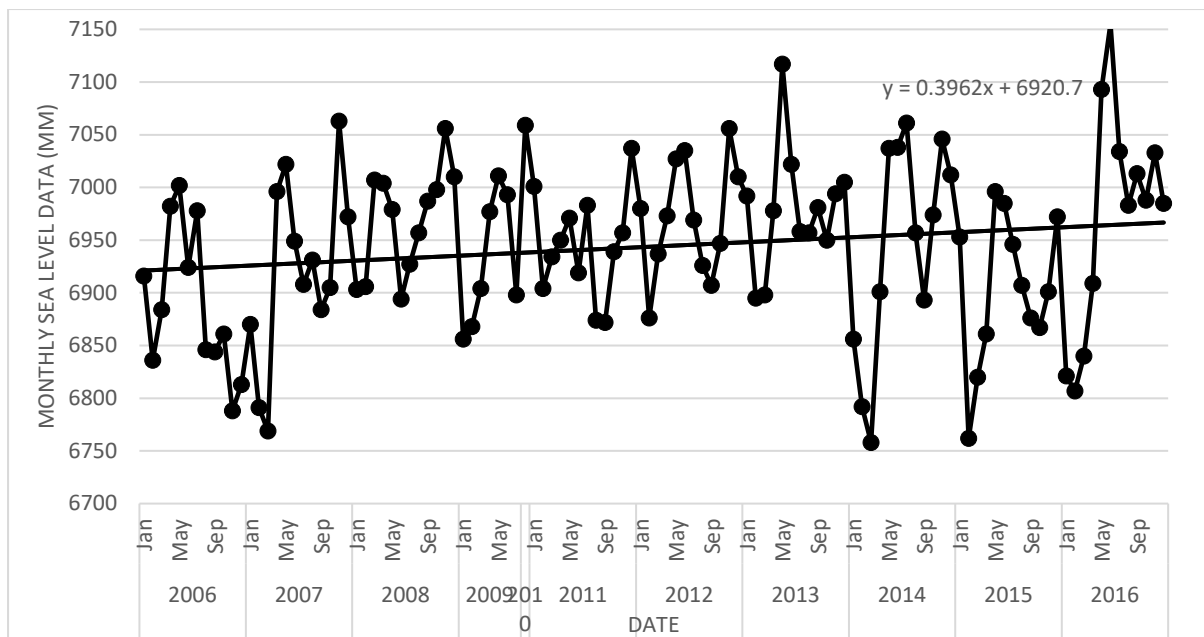
(b)

**Figure 1.** Banda Aceh coast, the study area at the northern tip of Sumatra Island of Indonesia. (a) The map of Banda Aceh showing the inundation of the 2004 tsunami at the coastal area on 26 December 2004 (denoted by the dark gray color), and the receding inundated area after four days on 29 December 2004 (denoted by the stripped gray color); (b) The aerial photo at the lower panel was taken in 1998 facing south-eastern coastal area, revealing the low-lying characteristics of the coastal system.

### 3. Data and Methods

#### 3.1. Rate of sea-level rise

The rate of sea-level rise from the last 10 years data (Fig. 2) were recorded from the Permanent Service for Mean Sea Level (PSMSL) database maintained by BMKG (Indonesian Meteorological and Climatological Agency) at the Sabang Station (5°52'36"N, 95°20'24"E), located ca. 27 km North of Banda Aceh coastline. Assuming that the influence of vertical movements due to seismic activities was negligible to the records of sea-level fluctuation, the records reveal an average trend of sea-level rise of  $6.2 \pm 0.4$  mm/year. Taking this rate into account, we project the arising sea-level up to +1.0 m from the present sea-level would be reached by 151 to 172 years later, and +1.5 m higher would be reached by 227 to 258 years later. Providing the probability of mega-tsunami recurrence of 200 years (Natawidjaja, *et al.* 2007), and the period considered fit into the engineering time-scale for coastal management, the scenario of sea-level rise to map the coastal inundation in the present study are set up as 0 m, +1.0 m and +1.5 m.



159

160 **Figure 2.** Trend of sea-level rise at Sabang Station north to Banda Aceh City of Sumatra Island of  
 161 Indonesia (Modified from PSMSL database by BMKG)

162

163 *3.2 Data analysis methods*

164 Literature study conducted by Ye, *et al.* (2018) shows that the polygon-based classification  
 165 design is a more favourable method for mapping specific land types, impervious surfaces and  
 166 vegetation patches compared to pixel-based (raster) method. In this study, the LULC  
 167 classification combines visual the office interpretation and field data. -We identify and compare  
 168 objects and patches from each satellite image based on our familiarity with the study area after  
 169 conducting several fieldworks for the previous post-tsunami 2004 studies (Meilianda, *et al.*,  
 170 2010; Meilianda, 2009 ; Meilianda, *et al.*, 2007), from most recent studies on the post-tsunami  
 171 coastal development at Banda Aceh coast (Syamsidik, *et al.*, 2017; Achmad, *et al.*, 2015; Rusdi,  
 172 *et al.*, 2015), and from the visually comparable identified objects using the high--resolution  
 173 satellite images. Three sets of high-resolution satellite images acquired on 23<sup>rd</sup> June 2004 (pre-  
 174 tsunami December 2004), 1<sup>st</sup> March 2011 and 14<sup>th</sup> May 2017 retrieved from the Google Earth  
 175 Pro - Digital Globe, were utilized for LULC delineation using ArcGIS software. Each of  
 176 acquired satellite image was already geo-referenced and spatially rectified. The LULC from  
 177 each images were obtained by digitization of discerniblediscernable objects into polygons. The  
 178 digitization was performed for-by using the unsupervised LULC classification scheme,  
 179 extracted from each high-resolution satellite image of 30 x 30 cm pixels, with areal coverage  
 180 of 15 km<sup>2</sup>.

181 In addition to the spatial works, the land cover types were further verified by ground-truth  
 182 survey and interview with the local inhabitants and the planning agency of Banda Aceh  
 183 Municipality. These procedures were resulting in a classification of the type of LULC which  
 184 are commonly identified in all of the three datasets.

185 *a. Scenarios of shoreline positions of the projected sea-level rise*

186 As for the analysis of the inundation extent at the coastal area by different scenarios of projected  
 187 sea-levels, a set of Digital Elevation Model (DEM) of 30 m vertical resolution data acquired  
 188 from the Shuttle Radar Topography Mission (RSTM). The inundation marked as the boundary  
 189 between land and water ( $\pm 0.0$  m, +1.0 m and +1.5 m) in polygon vector maps. Herein, we used  
 190 only the LULC polygon map of 2017 as the most recent situation upon which the projected  
 191 sea-level scenarios are applied. Then, this boundary line was clipped onto the LULC polygon  
 192 map to cut off the inundated areas. From there, the final non-inundated areas (in hectare) were  
 193 re-calculated. The results of the entire mapping operation are the polygon maps of LULC of  $\pm$   
 194 0 m, +1.0 m and +1.5 m. The overall methodological workflow is depicted in Fig. 3.

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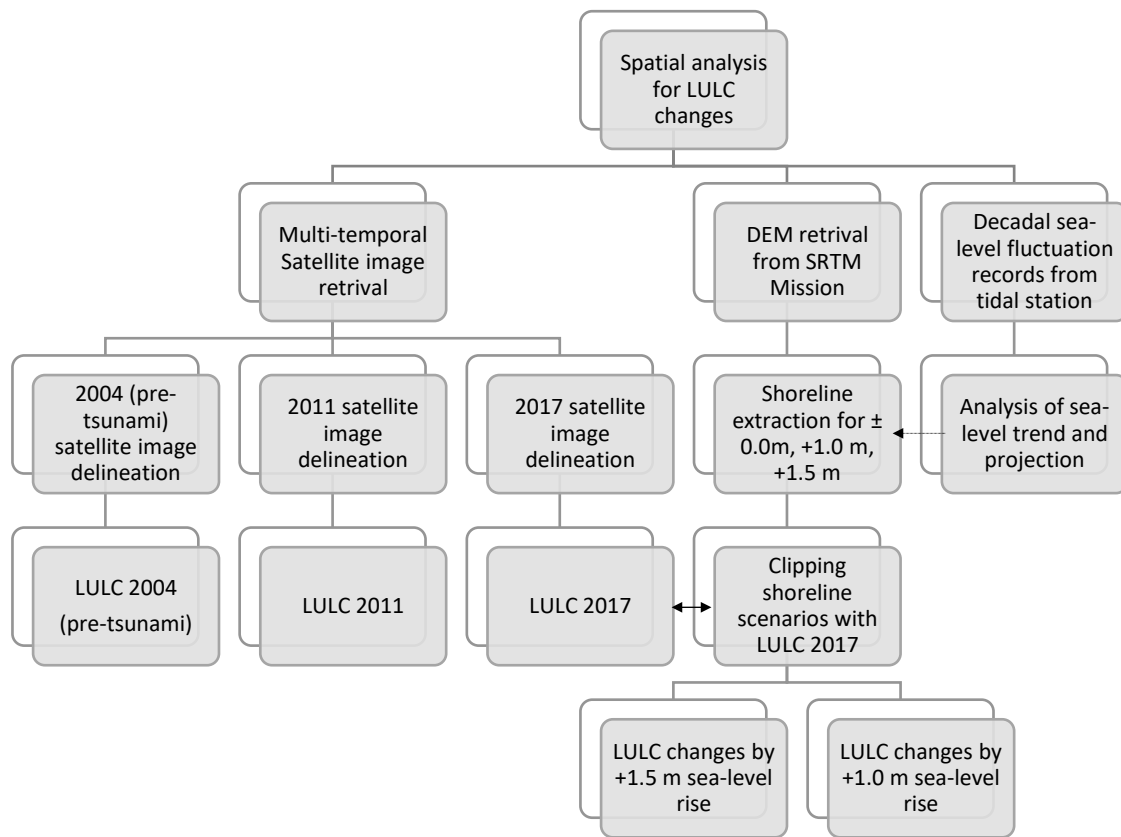
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**Figure 3.** Overall methodological work flow adopted in this study.

212 *b. Uncertainty analysis on LULC delineation*

213 The uncertainty of LULC is measured by the change detection of the size of comparable fixed  
 214 objects (e.g. buildings, land boundaries, road networks, etc.) in different satellite images. Here,  
 215 the uncertainty of the resulting polygon maps was assessed by the degree of similarity in the  
 216 size of an extracted object and the size of the corresponding object presented in the measured  
 217 reference data (Zhan, *et al.* 2005).

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$$Sim\_Size_i = \frac{\min(A_{obj}, A_{ref})}{\max(A_{obj}, A_{ref})} \quad (1)$$

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$$Mean_{Sim\_Size} = \frac{1}{n} \sum_{i=1}^n Sim\_Size_i \quad (2)$$



221

$$Std_{Sim\_Size} = \frac{1}{n} \sqrt{\sum_{i=1}^n (Sim\_Size_i - Mean_{Sim\_Size})^2} \quad (3)$$

223 **w**Where  $A_{obj}$  denotes the size of the extracted object, and  $A_{ref}$  denotes the size of the  
 224 corresponding object presented in the reference data. Herein, the most recent polygon data were  
 225 used as the corresponding objects, while the older ones used as the reference data.  $Mean_{Sim\_Size}$   
 226 is a measure that indicates the average similarity in terms of the size of all extracted objects.  
 227  $Std_{Sim\_Size}$  is the standard deviation of similarity in terms of the size of all extracted objects.

228 Six types of LULC were delineated for the individual satellite images in 2004, 2011 and 2017  
 229 consisting of the areas of buildings, bare land, aquaculture ponds, mangroves, rice fields and  
 230 swamp. Herein, we selected buildings, aquaculture ponds patches and mangroves areas as the  
 231 representative LULCs, since they are well-distributed across the studied coastal area. By  
 232 pairing the 2011 and 2017 datasets, we selected the polygon sample pairs of each LULC type  
 233 which have similarity in shape and size. Herein, the 2011 datasets serve as the reference object,  
 234 while the 2017 datasets serve as the extracted object. The 2004 or pre-tsunami datasets were  
 235 not included in the uncertainty analysis because of remarkable changes occurred to almost all  
 236 of the LULC types due to the tsunami event on 26 December 2004. Table 1 displays the overall  
 237 results of the uncertainty analysis in this study.

238 *Table 1 Uncertainties of polygon delineation of LULC types*

No.	LULC Type	Sample	Mean	Standard Deviation
1	Buildings	2900	0.96	0.05
2	Aquaculture ponds	140	0.98	0.04
3	Mangroves	138	0.98	0.08

239

240 The quality assessment results in a mean value of 0.96, 0.98 and 0.98 for similarity in size and  
 241 a standard deviation of 0.05, 0.04, and 0.08 for buildings, aquaculture ponds and mangroves,  
 242 respectively. These figures show a high degree of similarity in terms of polygon size; thus, the  
 243 major parts of the digitized type of LULC match the corresponding buildings, aquaculture  
 244 ponds and mangroves presented in the reference data. The low standard deviation shows that  
 245 consistent results are obtained for those extracted LULC types.

246

## 247 4. Results and Discussions

### 248 4.1 Comparing the pre- and post-tsunami land cover changes

249 The delineation of LULC from the high-resolution satellite images of 2004, 2011 and 2017  
 250 resulted in the areal coverage (in hectare) of each individual LULC types, which are displayed  
 251 in Fig. 4a, 4b and 4c. Herein, the swamp identified as the brackish water body situated inland,  
 252 which are not directly connected to the sea for it has sort of natural boundaries, such as natural  
 253 barrier island or spit, or man-made levee. It is not modified as aquaculture ponds patches and  
 254 no existence of mangroves colonies. **Whereas**ile, the mangroves areas are those where patches  
 255 of mangroves colonies exist. The aquaculture ponds **are**is identified as the inundated area



256 bounded by square embankments. The rice fields are those squared patches of land with a  
257 typically homogeneous vegetated surface.

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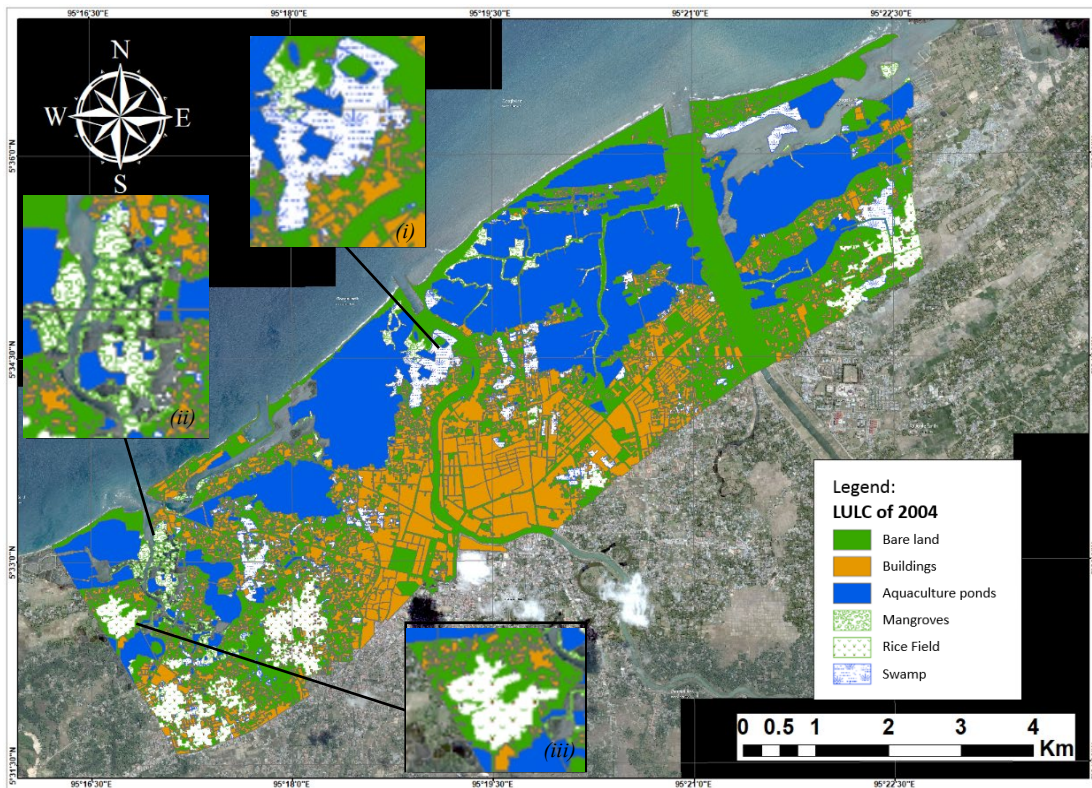
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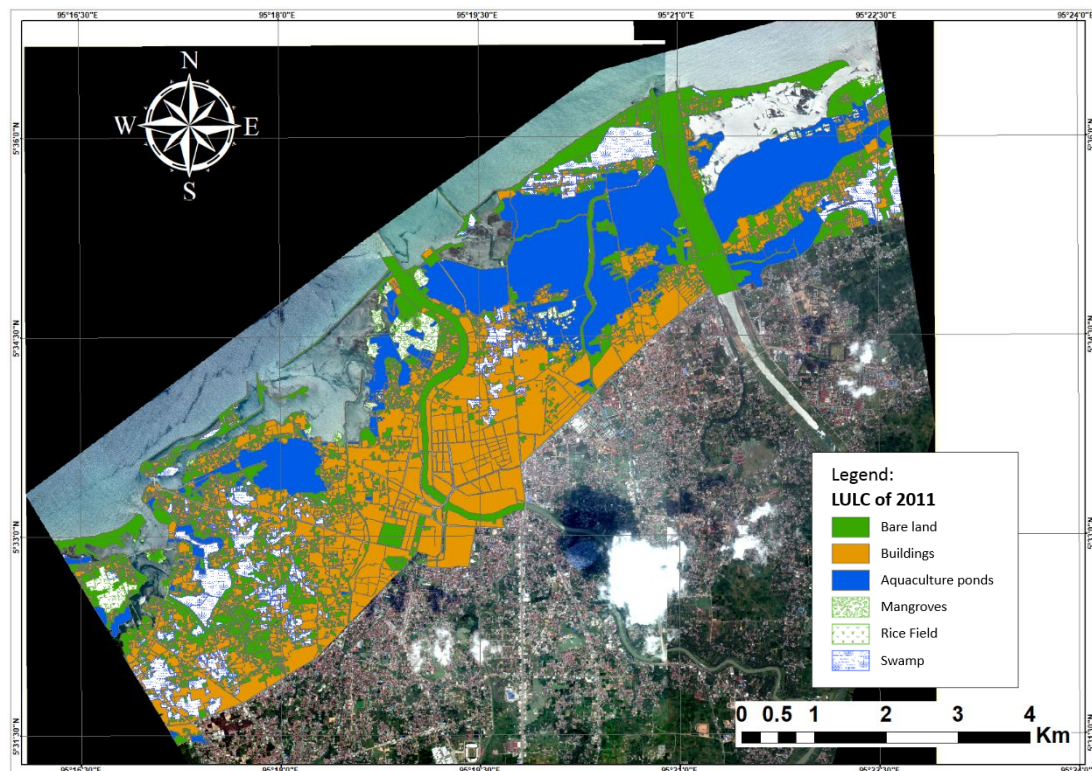
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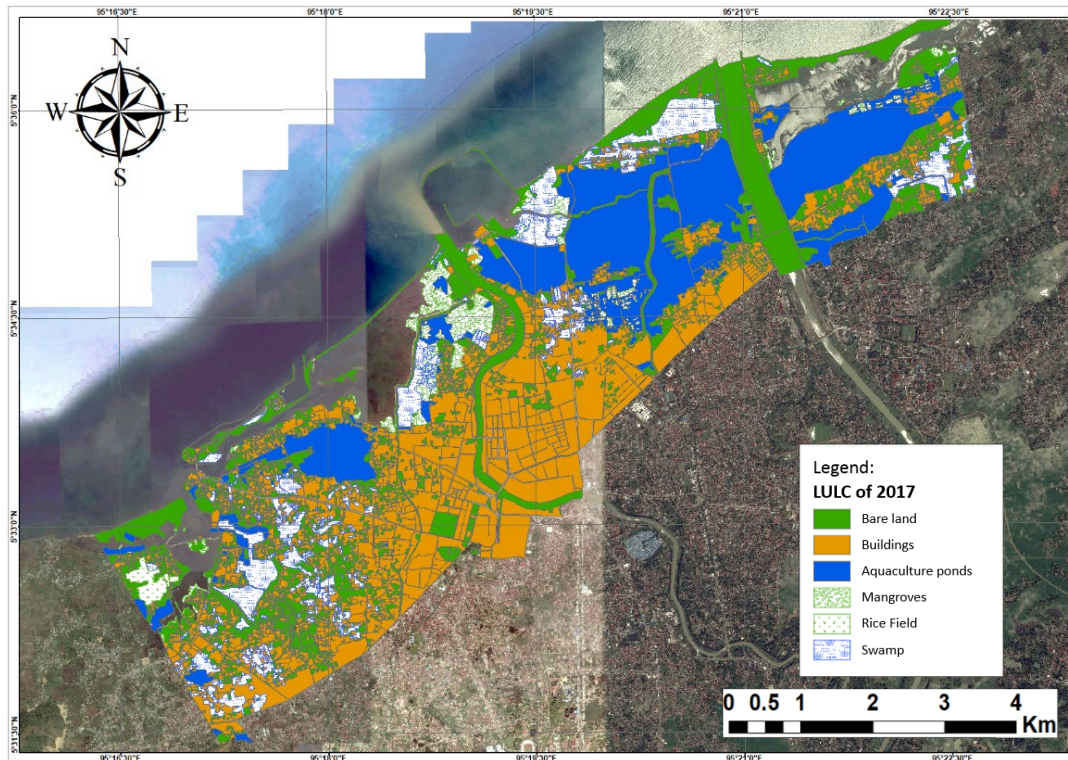
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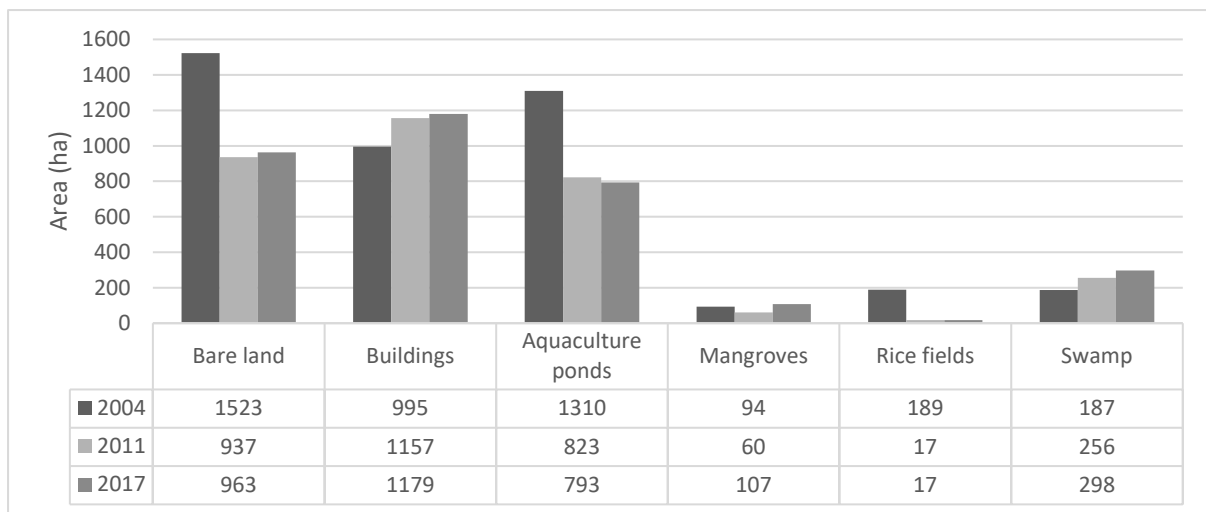
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(c)

303 **Figure 4.** Maps of LULC at the Banda Aceh coast. Six types of LULC identified typically covering the  
 304 coastal area of Banda Aceh for the 2004, 2011 and 2017, respectively. Three pre-dominant types are  
 305 aquaculture ponds, buildings and bare land. (a) LULC map of 2004, with the mangroves, rice fields and  
 306 swamp areas are zoomed-in for clarity in the insets *i*, *ii* and *iii*, respectively. The coverage areas of all  
 307 types of the consecutive years are quantified in Fig. 5.

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318 **Figure 5.** Areal changes (in hectare) in coastal land cover at Banda Aceh coast in 2004, 2011 and 2017.  
319 The areal coverage of bare land, buildings, and aquaculture ponds are persistently the top three largest  
320 areal coverage occupying the coastal area, even after the impact of tsunami event on 26 December 2004.

321 The LULC map of the pre-tsunami 2004 (Fig. 4a and Fig. 5) displays the areal coverage of  
322 bare land (1523 ha), buildings (995 ha), and aquaculture ponds (1310 ha) are the top three  
323 consecutively largest areal coverage occupying the coastal area. This is followed by the rice  
324 field, swamp and mangroves, which occupy 189 ha, 187 ha and 94 ha of the coastal area,  
325 respectively. In the following years after the tsunami destroyed the coastal area, the areal  
326 coverage of the aquaculture ponds, bare land, ~~rice~~ and rice field has ~~ve~~ been persistently  
327 declining. Interestingly, most of the losses of areal coverage are compensated by the increased  
328 areal coverage for buildings; which numbers are consecutively increasing from 1157 ha in 2011  
329 to 1179 ha in 2017. Additionally, some areas where they used to be aquaculture ponds were  
330 left to become abandoned swamp areas after being destroyed by the tsunami of 2004.

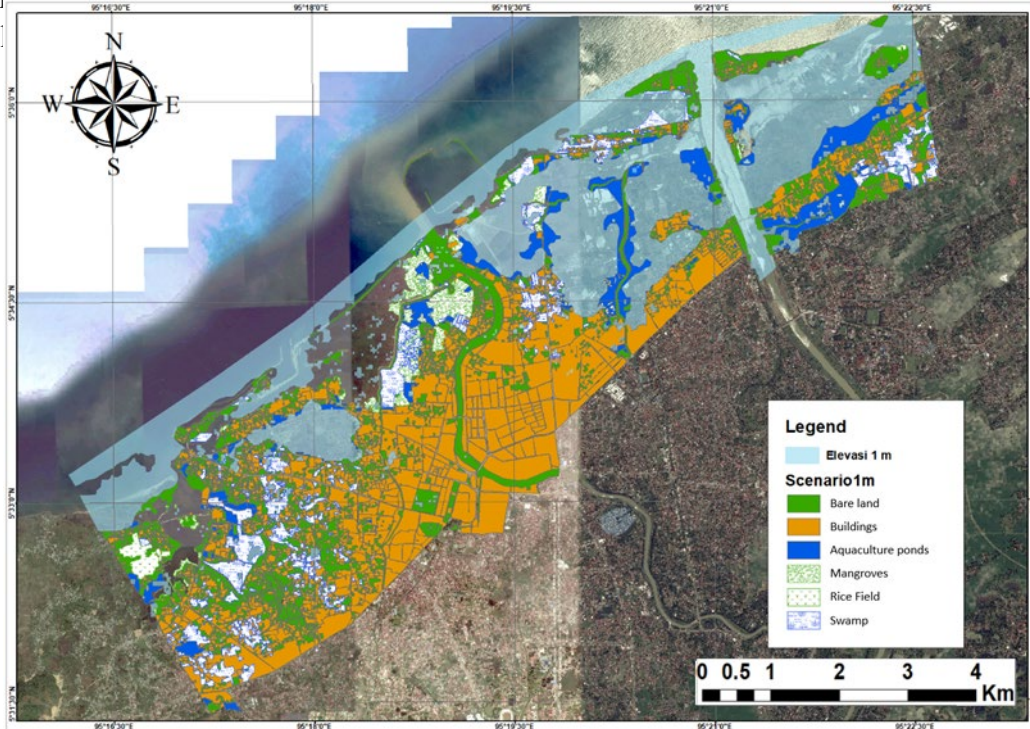
331 If we compare ~~between~~ the area of LULC types of ~~the~~ 2004 (pre-tsunami) and ~~the~~ 2011, and  
332 2017 (post-tsunami) in their respective current state, the bare land, buildings and aquaculture  
333 ponds remain as the top three largest LULC types occupying the coastal area, even after the  
334 impact of tsunami event on 26 December 2004. Despite, sharp declining areas experienced by  
335 bare land and aquaculture ponds. The areal coverage of the bare land is declining by 38.48%  
336 in 2011, and slightly increased by 36.77% in 2017. Similarly, the aquaculture ponds are sharply  
337 declining by 37.18% in 2011, and further by 39.47% in 2017 from the initial proportion in 2004  
338 (Fig. 5). Additionally, the sharp declining areal coverage was also experienced by the rice field  
339 area, which consistently reached 91% decrease for both years. On the contrary, the areal  
340 coverage of the buildings was increasing by 16.28 % in 2011, and even further by 18.49 % in  
341 2017 from the initial proportion in 2004. The swamp areas were also consistently increasing  
342 by 36.9% and 59.36% in 2011 and 2017, respectively. Interestingly, despite minor occupation  
343 at the coastal area, the areal coverage of mangroves shows a remarkable decline of areal  
344 coverage in 2011, but subsequently compensated by an increase by 13.83% in 2017, even  
345 slightly larger percentage than the areal coverage in the pre-tsunami. Such dynamic implies  
346 that there are a certain amount of predominant land covers such as aquaculture ponds, bare land  
347 and rice field that experienced significant loss due to the tsunami in 2004 that are not fully  
348 recovered after several years, in the expense of buildings area expansion. In addition, some of  
349 those aquaculture ponds which were destroyed by the tsunami were abandoned and eventually  
350 have become a merely swampy area. The expansion of mangroves in the area after several  
351 years post-tsunami may suggest that the effort of mangroves planting projects during the  
352 rehabilitation and reconstruction may have been successful to some extent.

#### 353 *4.2 Scenario of the sea-level rise*

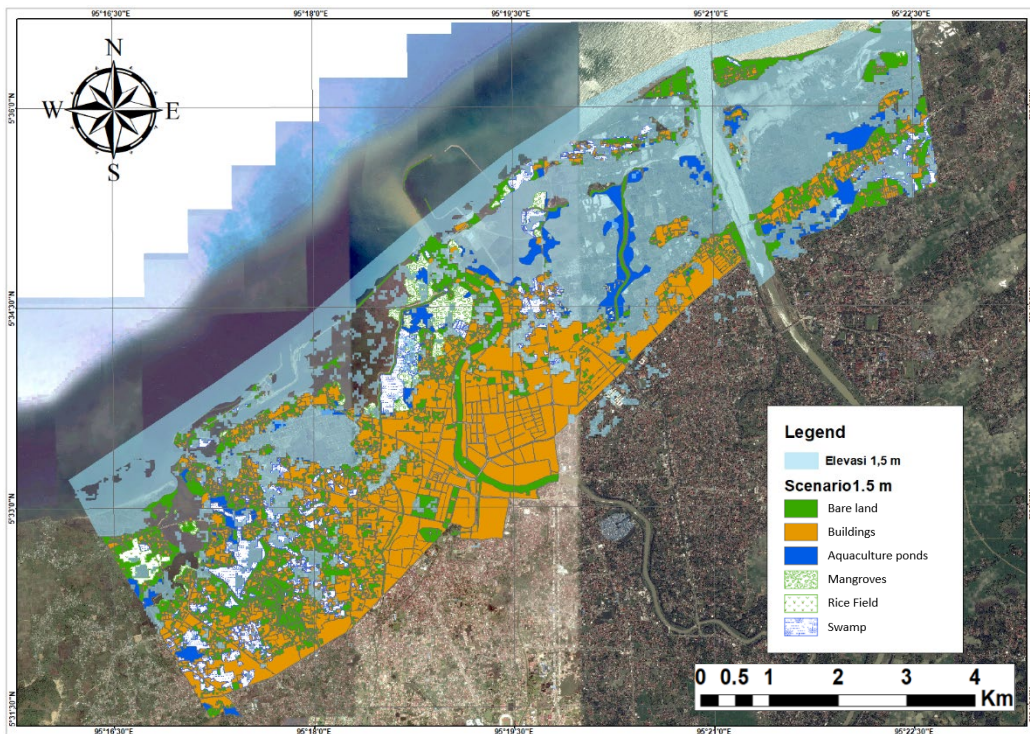
354 As was depicted in Fig. 2, the monthly sea-level fluctuation was plotted by the daily average  
355 mean sea-level clearly exhibiting a non-stationary change of sea-level, which actually  
356 represents the magnitude and direction of tidal fluctuation occurring in the region. Presumably,  
357 the land-level has not changed since the 2004 tsunami (e.g. no local land subsidence or  
358 liquefaction), and the tidal range is average less than 1 m (micro\_tidal area); it is safely assumed  
359 that the rate of sea-level rise pre-dominantly eustatic.

360 If we compare between the consecutive scenarios of sea-level +1.0 m and +1.5 m, the  
361 aquaculture ponds area were remarkably declining, not only between the year 2011 to 2017

362 without any scenario, but more importantly the declining area of aquaculture ponds area due to  
363 sea-level arising up to +1.0 m and even further on scenario +1.5 m. Such remarkable changes  
364 of typical wetland features (swamp and aquaculture ponds) seem to be the most vulnerable  
365 coasta



(a)



(b)

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392 **Figure 6.** Land cover changes of Banda Aceh coast in 2017 based on two scenarios of sea-level changes.  
 393 (a) The existing land cover; (b) the land cover with +1.0 m sea-level rise; (c) the land cover with +1.5  
 394 m sea-level rise.

395

396 **Table 2** Comparable areal coverage of various land cover types at Banda Aceh coast (baseline 2017)

Land cover type	No scenario		Scenario +1.0 m		Scenario +1.5 m	
	Area	Percentage	Area	Percentage	Area	Percentage
<b>Buildings</b>	1179	35.12%	1145	34.11%	1067	31.78%
<b>Bare land</b>	963	28.69%	723	21.54%	619	18.44%
<b>Aquaculture ponds</b>	793	23.62%	246	7.33%	171	5.09%
<b>Swamp</b>	298	8.88%	228	6.79%	166	4.94%
<b>Mangroves</b>	107	3.19%	83	2.47%	72	2.14%
<b>Rice Field</b>	17	0.51%	17	0.51%	13	0.39%
<b>Inundation</b>	0	0.00%	915	27.26%	1249	37.21%
<b>Total area</b>	3357	100.00%	3357	100.00%	3357	100.00%

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398 Table 2 displays the comparison of area coverage of various LULC types among scenarios of  
 399 sea-level rise at the coastal area of Banda Aceh, taking into account the most recent situation;  
 400 i.e., LULC of 2017, as the baseline of the sea-level rise projection. The results show that in  
 401 total, the scenario of sea-level rise of +1.0 m and +1.5 m will cause a loss of land as much as  
 402 27% and 37%, respectively, in 250 years from 2017. A consistent loss of the wetlands occurred  
 403 as the excessive impact by the tsunami waves attacks in 2004 as well as by the half-destroyed  
 404 aquaculture ponds left to be abandoned. This results in a percentage of aquaculture ponds areal  
 405 coverage plunging from 1310 ha before the tsunami, to merely 823 ha and 793 ha, in respective  
 406 2011 and 2017. Based on the scenarios of +1.0 m and +1.5 m, the aquaculture ponds would be  
 407 severely affected by the sea-water inundation, leaving respectively only 7.33% and 5.09% of  
 408 the total areal coverage. Adaptations to this impact most likely to consider movement inland  
 409 of some operations that culture species with acceptable saline tolerance.

410 On the other hand, learning from the first decade of the post-tsunami recovery in Banda Aceh  
 411 (e.g. Syamsidik, *et al.*, 2017; Achmad, *et al.*, 2015; Affan, *et al.*, 2015), the trend shows that  
 412 there is an increase of built environment expansion towards the coastline, despite past tsunami  
 413 experience. The results of this study confirms these views, that there was an increasing number  
 414 of buildings after the tsunami, from 2011 to 2017. The results of the spatial analysis for the  
 415 sea-level rise scenarios of +1.0 m and +1.5 m (see Table 2) reveals that, being one of the largest  
 416 types of LULC, the buildings slightly decrease in numbers. However, if we take into account  
 417 the total loss of land by the respective inundation scenarios, then they suggest that the  
 418 number of buildings was actually increasing considerably, closer to the coastline. The bare  
 419 land which apparently has potential to be developed for the settlement area (buildings,  
 420 housings, etc.) for the current situation, would also potentially suffer from inundation in future,  
 421 based on both +1.0 m and +1.5 m scenarios (see Table 1, Fig. 6a and 6b).

422 Overall, the coastal area of Banda Aceh in the next couple of centuries will be highly vulnerable  
 423 if the current fast-growing and ever-expanding built environment very close to the coastline  
 424 would still be applied in the future. Sound coastal management to protect the coastal areas

425 which areis still recovering from the massive destruction caused by the past tsunami event,  
426 therefore, should be planed properly by taking into account the risk of future slow on-set  
427 disaster, particularly the sea-level rise.

428

429

## 430 **5. Conclusions**

431 Banda Aceh coast at the northern tip of Sumatra Island of Indonesia is uniquely representing  
432 the coast threatened by both eustatic sea-level rise and seismic-driven tsunamis and land-level  
433 changes. Scenarios of how the projected sea-level rise in centennial time scale would inundate  
434 the low-lying coastal area are investigated in this study, to understand the potential impact to  
435 the dynamic change of LULC at the coastal city, particularly, after being devastated by the  
436 tsunami disaster in 2004. The objective of the present study is to investigate the impact of the  
437 projected sea-level rise to the coastal land covers encompassing an engineering time-scale,  
438 based on a couple of sea-level rise scenarios.

439 Out of six types of pre-dominant land covers at the studied area, the bare land, aquaculture  
440 ponds and buildings are among the top three largest types of LULC occupy the coastal area in  
441 Banda Aceh coast. The spatial change detection analysis reveals that in total, the scenario of  
442 sea-level rise of +1.0 m and +1.5 m will cause a loss of land as much as 27% and 37%,  
443 respectively, in the next couple of centuries from the present. The area of low-lying or wetland  
444 has been increasing, by the fact that the destroyed aquaculture ponds due to the tsunami were  
445 not all fully recovered, leaving a larger area of the abandoned swamp. Whereas, the bare land  
446 at the areas nearest to the coastline has been increasingly converted into settlement areas, which  
447 clearly reveals the potential negative impact of the accelerating sea-level rise in future.

448 Overall, the results of this study imply that the coastal area of Banda Aceh is expected to be  
449 more vulnerable in the future centuries. Thus, the impact of the sea-level rise to the LULC at  
450 the coastal area should be carefully considered in setting up a new master plan of the coastal  
451 city of Banda Aceh, which encompassing a long-term adaptation and mitigation strategies.

452

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