# Spatial planning model for optimization of conservation priority for local community utilization in Marine Protected Area: A case study of the Raja Ampat Marine Protected Area (MPA) on Arefi Island, West Papua, Indonesia (#99998)

First submission

#### Guidance from your Editor

Please submit by 21 Aug 2024 for the benefit of the authors (and your token reward) .



#### **Structure and Criteria**

Please read the 'Structure and Criteria' page for guidance.



#### Raw data check

Review the raw data.



#### Image check

Check that figures and images have not been inappropriately manipulated.

If this article is published your review will be made public. You can choose whether to sign your review. If uploading a PDF please remove any identifiable information (if you want to remain anonymous).

#### **Files**

Download and review all files from the <u>materials page</u>.

6 Figure file(s)

6 Table file(s)

# Structure and Criteria



#### Structure your review

The review form is divided into 5 sections. Please consider these when composing your review:

- 1. BASIC REPORTING
- 2. EXPERIMENTAL DESIGN
- 3. VALIDITY OF THE FINDINGS
- 4. General comments
- 5. Confidential notes to the editor
- You can also annotate this PDF and upload it as part of your review

When ready submit online.

#### **Editorial Criteria**

Use these criteria points to structure your review. The full detailed editorial criteria is on your guidance page.

#### **BASIC REPORTING**

- Clear, unambiguous, professional English language used throughout.
- Intro & background to show context.
  Literature well referenced & relevant.
- Structure conforms to <u>PeerJ standards</u>, discipline norm, or improved for clarity.
- Figures are relevant, high quality, well labelled & described.
- Raw data supplied (see <u>PeerJ policy</u>).

#### **EXPERIMENTAL DESIGN**

- Original primary research within Scope of the journal.
- Research question well defined, relevant & meaningful. It is stated how the research fills an identified knowledge gap.
- Rigorous investigation performed to a high technical & ethical standard.
- Methods described with sufficient detail & information to replicate.

#### **VALIDITY OF THE FINDINGS**

- Impact and novelty is not assessed.

  Meaningful replication encouraged where rationale & benefit to literature is clearly stated.
- All underlying data have been provided; they are robust, statistically sound, & controlled.



Conclusions are well stated, linked to original research question & limited to supporting results.

# Standout reviewing tips



The best reviewers use these techniques

Τ	p

# Support criticisms with evidence from the text or from other sources

# Give specific suggestions on how to improve the manuscript

# Comment on language and grammar issues

# Organize by importance of the issues, and number your points

# Please provide constructive criticism, and avoid personal opinions

Comment on strengths (as well as weaknesses) of the manuscript

#### **Example**

Smith et al (J of Methodology, 2005, V3, pp 123) have shown that the analysis you use in Lines 241-250 is not the most appropriate for this situation. Please explain why you used this method.

Your introduction needs more detail. I suggest that you improve the description at lines 57-86 to provide more justification for your study (specifically, you should expand upon the knowledge gap being filled).

The English language should be improved to ensure that an international audience can clearly understand your text. Some examples where the language could be improved include lines 23, 77, 121, 128 – the current phrasing makes comprehension difficult. I suggest you have a colleague who is proficient in English and familiar with the subject matter review your manuscript, or contact a professional editing service.

- 1. Your most important issue
- 2. The next most important item
- 3. ...
- 4. The least important points

I thank you for providing the raw data, however your supplemental files need more descriptive metadata identifiers to be useful to future readers. Although your results are compelling, the data analysis should be improved in the following ways: AA, BB, CC

I commend the authors for their extensive data set, compiled over many years of detailed fieldwork. In addition, the manuscript is clearly written in professional, unambiguous language. If there is a weakness, it is in the statistical analysis (as I have noted above) which should be improved upon before Acceptance.



# Spatial planning model for optimization of conservation priority for local community utilization in Marine Protected Area: A case study of the Raja Ampat Marine Protected Area (MPA) on Arefi Island, West Papua, Indonesia

Debora Christi Simamora  $^1$ , Mulyanto Darmawan  $^{\text{Corresp.},\,2}$ , Fadhlullah Ramadhani  $^2$ , Dewayany Sutrisno  $^3$ , Fahmi Amhar  $^2$ , Muhammad Ramdhan  $^2$ , Irmadi Nahib  $^4$ , Syamsul Bahri Agus  $^1$ 

Corresponding Author: Mulyanto Darmawan Email address: muly023@brin.go.id

This study addresses the critical role of spatial planning in marine conservation, particularly within the Raja Ampat Marine Protected Area (MPA) located on Arefi Island, West Papua, Indonesia. Despite the recognized ecological significance of this region, characterized by diverse ecosystems such as mangroves, seagrass beds, and coral reefs, a gap exists in effectively integrating these natural assets into conservation strategies that empower local and indigenous communities. To bridge this gap, we applied Marine Reserve Design Using Spatially Explicit Annealing (Marxan) Models as a zonation tool in spatial planning to delineate conservation zones within the MPA. Our approach centers on leveraging the area's biodiversity to achieve conservation goals that are synergistic with the socioeconomic needs of the indigenous population. Through analyzing three Ecological Value-based scenarios, each scenario aiming to quantify and prioritize conservation features, we explored the potential for sustainable ecosystem utilization while ensuring the protection of critical habitats. The outcomes reveal that among the scenarios tested, the one denominated Ecological Value III aligns most closely with international conservation standards, saving 34.37 ha (6.32% of the total area) as a core conservation zone. However, Ecological Scenario II presented a balanced approach, offering more significant areas for local community use while maintaining conservation integrity. This scenario emphasizes the necessity of incorporating traditional knowledge and community involvement in conservation efforts. The findings advocate for an adaptive management strategy, highlighting the vital role of geospatial technology in safeguarding marine biodiversity and supporting sustainable resource use in Indonesia's coastal ecosystems

<sup>1</sup> Department of Marine Science and Technology, IPB University, Bogor Institute of Agriculture, Bogor, West Java, Indonesia

Research Center for Geoinformatics, National Innovation and Research Agency (BRIN), Bandung, West Java, Indonesia

<sup>&</sup>lt;sup>3</sup> Research Center for Conservation of Marine and Inland Water Resources, National Innovation and Research Agency (BRIN), Bogor, West Java, Indonesia

<sup>4</sup> Research Center for Limnology and Water Resources, National Research and Innovation Agency of Indonesia (BRIN), Bogor, West Java, Indonesia



- Spatial Planning Model for Optimization of
- **2 Conservation Priority for Local Community Utilization**
- 3 in Marine Protected Area: A Case Study of the Raja
- 4 Ampat Marine Protected Area (MPA) on Arefi Island,
- 5 West Papua, Indonesia

6 7

Debora Christi Simamora<sup>1</sup>, Mulyanto Darmawan<sup>2</sup>, Fadhlullah Ramadhani<sup>2</sup>, Dewayany Sutrisno<sup>3</sup>,
 Fahmi Amhar<sup>2</sup>, Muhammad Ramdhan<sup>2</sup>, Irmadi Nahib<sup>4</sup>, Syamsul Bahri Agus<sup>1</sup>

10

- 11 Department of Marine Science and Technology, IPB University, Bogor, West Java, Indonesia
- 12 <sup>2</sup> Research Center for Geoinformatics, National Research and Innovation Agency of Indonesia
- 13 (BRIN), Bandung, West Java, Indonesia
- 14 <sup>3</sup> Research Center for Conservation of Marine and Inland Water Resources, National Innovation
- and Research Agency (BRIN), Bogor, West Java, Indonesia
- <sup>4</sup> Research Center for Limnology and Water Resources, National Research and Innovation
- 17 Agency of Indonesia (BRIN), Bogor, West Java, Indonesia

18

- 19 Corresponding Author:
- 20 Debora Simamora <sup>1</sup>
- 21 Street Address, Bogor, West Java, 16680, Indonesia
- 22 Email address: Muly023@brin.go.id

2324

#### **Abstract**

- 25 This study addresses the critical role of spatial planning in marine conservation, particularly
- 26 within the Raja Ampat Marine Protected Area (MPA) located on Arefi Island, West Papua,
- 27 Indonesia. Despite the recognized ecological significance of this region, characterized by diverse
- 28 ecosystems such as mangroves, seagrass beds, and coral reefs, a gap exists in effectively
- integrating these natural assets into conservation strategies that empower local and indigenous communities. To bridge this gap, we applied Marine Reserve Design Using Spatially Explicit
- 31 Annealing (Marxan) Models as a zonation tool in spatial planning to delineate conservation
- 32 zones within the MPA. Our approach centers on leveraging the area's biodiversity to achieve
- 33 conservation goals that are synergistic with the socioeconomic needs of the indigenous
- 34 population. Through analyzing three Ecological Value-based scenarios, each scenario aiming to
- 35 quantify and prioritize conservation features, we explored the potential for sustainable ecosystem
- 36 utilization while ensuring the protection of critical habitats. The outcomes reveal that among the
- 37 scenarios tested, the one denominated Ecological Value III aligns most closely with international
- 38 conservation standards, saving 34.37 ha (6.32% of the total area) as a core conservation zone.



However, Ecological Scenario II presented a balanced approach, offering more significant areas for local community use while maintaining conservation integrity. This scenario emphasizes the necessity of incorporating traditional knowledge and community involvement in conservation efforts. The findings advocate for an adaptive management strategy, highlighting the vital role of geospatial technology in safeguarding marine biodiversity and supporting sustainable resource use in Indonesia's coastal ecosystems.

**Keywords:** Marine Protected Area, conservation zones, biodiversity conservation, Marxan Models, spatial zoning.

#### Introduction

Indonesia boasts some of the world's richest marine biodiversity. Indonesia contains an estimated 16% of the world's coral reefs and over 5% of seagrass beds and has the most extensive mangroves on Earth, accounting for 23% of the world's total (Amkieltiela et al. 2022). These productive ecosystems provide many benefits, such as filtering pollutants, nutrition, coastal protection, livelihoods, and carbon storage. Due to these benefits, Indonesia has a high priority for conservation, particularly in Raja Ampat Marine Protected Area Regency of Arefi Island West Papua Province. Conservation of the marine environment is critical for upholding the Earth's natural processes, overseeing its reactions to substantial forthcoming challenges like addressing climate change impacts, and ensuring the well-being and advantages of society (Marcos et al. 2021).

Indonesia's government has established protected areas (PAs) to implement biodiversity conservation and sustainability management. Indonesia has established 411 MPAs across its archipelago, covering approximately 9% of its territorial waters, which amounts to over 28 million hectares (Estradivari et al. 2022). One of these areas is the Raja Ampat Islands in the Raja Ampat Regency, West Papua Province (Kepmen KP, 2014). This MPA is divided into five areas with a total area of approximately 1,026,540 hectares. Each area has specific zones that play a crucial role in managing and conserving natural resources, providing a framework for effective planning and sustainable development. In this context, the term "zone" refers to a defined area with specific characteristics or purposes, often demarcated for conservation, resource management, or other regulatory objectives (Permen KP, 2016). The zones in this conservation area include the core, utilization, fisheries, and other zones. The other zones are divided into two subzones: the traditional use and seasonal closure subzone and the other utilization subzone.

 For marine biodiversity conservation, MPAs are defined as marine, coastal, or small island areas that are protected and managed by a zoning system to achieve sustainable management of fish resources and biodiversity conservation (Green et al. 2009). MPAs are essential tools for conserving marine biodiversity and sustaining ecosystem services (Claudet et al. 2020). In



particular, MPAs with well-designed spatial planning strategies are more effective in achieving conservation goals (Edgar et al. 2014). With the increasing threats posed by human activities such as overfishing, habitat destruction, and climate change, effective spatial planning within MPAs becomes essential for sustainable management. (Mora, et al. 2019).

Raja Ampat Regency, located in West Papua, Indonesia, has a variety of natural tourism charms, both land, and sea and has socio-cultural riches for its exceptional marine biodiversity. In recent years, the MPA area distributed in Raja Ampat, encompassing Arefi Island, has faced mounting pressures from anthropogenic activities, necessitating comprehensive conservation strategies to ensure its long-term sustainability. Spatial planning, utilizing advanced modeling techniques, emerges as a valuable tool for optimizing conservation efforts within MPAs. However, increasing anthropogenic pressures, such as overfishing and habitat destruction, threaten the ecological integrity of the Raja Ampat MPA and the sustainability of Arefi Island's marine ecosystems (Cinner et al. 2018). To address these challenges, effective spatial planning within MPAs is essential (White et al. 2018). Spatial planning involves systematically allocating marine areas for different uses, considering ecological, social, and economic objectives (Agardy et al. 2011).

This extensive conservation area certainly has shortcomings in certain areas, as exemplified by Arefi Island. Arefi Island and its surroundings are located within other zones in the marine conservation area in Raja Ampat (Kepmen KP, 2014). The decree, while acknowledging the significance of Arefi within the broader context of marine conservation, lacks the necessary specificity to harness its full potential. Specifically, the decree falls short in delineating the subzone's boundaries. It fails to address the diverse ecosystems and biodiversity present and optimize the use of these marine resources by indigenous communities, hindering the realization of its conservation objectives. For an MPA to be effective and beneficial to the surrounding communities, determining its location must consider four main principles: Connectedness, Adequacy, Representativeness, and Effectiveness (CARE) (Ban et al. 2011). Based on numerous studies, the ideal proportion of coastal areas that should be protected is 20-30% of the total coastal area. Furthermore, the minimum core zone area within a Marine Protected Area is 20-30% to ensure the sustainability of the targeted biota stocks (Krueck et al. 2017).

This gap in applying the CARE principles within the context of Arefi Island's designation underlines a critical issue in marine conservation efforts in Indonesia and similar biodiverse regions globally. While establishing MPAs is a significant step towards conservation, the lack of precise boundary delineation, coupled with inadequate consideration for the complex mosaic of ecosystems, impedes the strategic planning necessary for effective conservation. The existing decree's broad strokes approach fails to account for the ecological and socio-economic nuances of Arefi Island, leading to a mismatch between conservation objectives and on-ground realities. This oversight not only compromises the ecological integrity of the protected area but also the



livelihoods and cultural heritage of the indigenous communities dependent on these marine resources. Moreover, the shortfall in aligning with the recommended coverage and core zone area for MPAs further exacerbates the challenges faced in achieving sustainable conservation outcomes. Addressing these gaps requires a comprehensive, data-driven approach to MPA management that emphasizes spatial planning and community involvement, ensuring biodiversity conservation and socio-economic resilience.

125126

127

128

129

130131

132

133

134

137

138

139140

Thus, effective maritime planning is required to design marine conservation areas. In maritime planning, processing, and analyzing information with spatial dimensions is crucial. Therefore, implementing maritime planning within the Geographic Information System (GIS) framework provides significant benefits. The effective maritime planning process includes evaluating various objectives, identifying conflicts or synergies in marine use, the risk of human activities, spatial zone management, and scenario testing. Stelzenmüller et al. (2013) stated that the assessment of conservation area planning can be quickly done using practical tools. These tools encompass risk assessment, forecasting, modeling, and other decision support tools, such as simulation models, to address 'what if' questions or scenarios for developing planning options.

135 136

This study aims to explore the complexities of the Arefi subzone's conservation by leveraging existing biodiversity elements so that the community can optimally utilize them. This study aims to redesign zoning within the MPA to protect biodiversity and support the sustainable management of marine resources by the community. Through this research, we aspire to contribute valuable insights to marine conservation planning to develop a robust and sustainable spatial unit plan for the Arefi subzones.

141142143

#### **Materials & Methods**

144 Study Area

- This research was conducted in Area III of MPA, Dampier Strait, Arefi Island, Raja Ampat
- Regency, West Papua (Fig. 1). The Raja Ampat MPA in West Papua, Indonesia, encompasses a
- vast and diverse marine ecosystem, including Arefi Island. This region is recognized for its
- exceptional biodiversity and ecological importance (Allen and Erdmann, 2012). Arefi Island,
- situated within the Raja Ampat MPA, harbors significant marine biodiversity and provides
- critical habitats for various species, including corals, fish, and endangered marine mammals
- 151 (Trip et al. 2019).

152

- 153 The Dampier Strait is renowned for its ecological richness, making it a popular tourist
- destination. As an area with a well-functioning aquatic ecosystem and fisheries, this region is
- also strategically important for those looking to exploit the benefits of fisheries resources.
- Despite being categorized under 'other zones,' satellite data reveals the rich bio-physical potential
- of Arefi Island (McKenna et al. 2002; RPZ Raja Ampat 2018). The island exhibits characteristics
- that make it a suitable candidate for various conservation zones, including core, fisheries, and



sustainable utilization. This potential underscore the need for a comprehensive and nuanced zoning strategy to fully harness and protect the diverse ecosystems found on and around Arefi Island.

162163

Figure 1. Study area map in Arefi Island, Raja Ampat District

164 165

166

167

168

169

170

171 172

173

174

175176

177

178

The Arefi region, enriched with indigenous cultures, practices the "sasi" tradition, deeply rooted in their rich cultural heritage. This customary resource management system, involving periodic closures, is designed to allow ecosystem recovery, ensuring resource sustainability (Sairiltiata, 2023). The "sasi" tradition offers an avenue for eco-tourism, presenting visitors with an authentic and culturally immersive experience. Specifically, the communities of Arefi and Yansaway on Batanta Island are revisiting "sasi gereja," a localized traditional conservation method that harmonizes traditional laws with church teachings, in response to the marked decline in marine resources and environmental degradation. "Sasi gereja" is set for reintroduction on Way Island, known for its rich marine biodiversity, including fish, sea cucumbers, clams, and lobsters. This initiative involves a unique ceremonial process where a church service marks the beginning of the "Sasi" period, ceasing fishing activities to give nature a rest period for rejuvenation. A concluding service signifies the end of the closure period, following the belief that the marine resources have adequately recovered. Non-compliance with the "sasi gereja" commands penalties, underscoring the community's commitment to this eco-culturally integrated

179 180 181

182

183

184 185

186

187

188 189

190

191

192

193 194

195

196197

198

#### **Biophysics Parameters**

conservation strategy (McKenna et al. 2002).

Biophysical parameters were obtained from the classification of high-resolution Worldview 3 satellite images in 2021 provided by the Center for Data and Information (Pusdatin) BRIN. The spatial resolution of these satellite images is approximately 0.6 meters, enabling detailed analysis and mapping of terrestrial and aquatic ecosystems. The WorldView 3 satellite imagery, as detailed by Choudhury et al. (2021), encompasses a broad spectrum of multispectral bands, each targeting specific wavelengths that are instrumental in distinguishing various surface materials and conditions. The Coastal band (400-450 nm) is designed to penetrate aquatic environments, offering insights into water clarity and sediment levels. The Blue band (450-510 nm) and the Green band (510-580 nm) are critical for assessing water body depths and the health of aquatic vegetation. The Yellow band (585-625 nm) helps differentiate soil and vegetation types. Given its sensitivity to chlorophyll absorption, the Red band (630-690 nm) is particularly effective in identifying vegetation. The Red edge band (705-715 nm) marks the transition between the red and near-infrared parts of the spectrum, providing valuable information on vegetation health and stress. Furthermore, the Near-Infrared one band (770-895 nm) and Near-Infrared two band (860-1040 nm) are paramount for analyzing biomass content and water body delineations. These bands are essential for identifying and quantifying vegetation types and densities, soil moisture levels, and other critical environmental variables (Table 2).



199

Due to the high resolution of the satellite images, a thorough image analysis is required. At this 200 stage, classification methods based solely on pixel information are minimal due to spectral 201 similarities. To overcome this limitation, object-based image analysis (OBIA) can be a valuable 202 203 tool to differentiate cover classes. OBIA is a distinct option from pixel-based methods, using image objects as the basic unit of analysis rather than individual pixels (Hossain and Chen, 204 2019). OBIA is an iterative process that starts by dividing satellite images into cohesive and 205

contiguous image segments. The resulting image objects are then assigned to the intended classes 206 207

through the use of supervised or unsupervised classification approaches (Belgiu and Csillik.

208 2018). According to Ventura et al. (2018), the OBIA workflow initially involves image

segmentation (a series of segmentation processes based on parameters of pixels with the same 209

spectral values). In this study, we utilized the Multi-resolution Segmentation (MRS) algorithm, a 210

211 process for image objects aimed at minimizing average heterogeneity and maximizing

212 homogeneity. Three crucial parameters in implementing the MRS algorithm are shape,

compactness, and scale (Darmawan et al. 2022). OBIA analysis was done using the eCognition

214 Developer 64 software.

> The segmentation results were then classified using Support Vector Machines (SVM) algorithms. a sophisticated non-parametric classifier widely employed in hyperspectral image classification, which operates based on statistical learning theory (Tan et al. 2018). It is designed to seek an optimal decision hyperplane within a high-dimensional space, ensuring an optimal separation of classes. SVM consistently performs well in challenging classification scenarios with highdimensional features, demonstrating effectiveness even when dealing with a limited number of training samples (Cao et al. 2018). The fundamental concept behind SVM is to identify a hyperplane that maximizes the margin between distinct classes. This hyperplane is expressed through the following equation:

224 225

228

230

213

215 216

217

218

219

220

221

222 223

226 
$$f(x) = \sum_{i=1}^{n} \alpha_i y_i K(x, x_i) + b$$
227 where,  $f(x)$ : decision function

: coefficients obtained during the training process

: class label of the training sample  $x_i$ 229

 $K(x_i,x_i)$ : kernel function

: bias term 231

232 233

234

235

The predicted class of the input data point x is the determined by f(x). If f(x) > 0 then the data point is classified as belonging to one class. If f(x) < 0 then the data point is classified as belonging to another class. The classified data, field, and secondary observations, are then input into the Marxan software.

236 237

## PeerJ

238

#### **Marxan Models**

239 Marine Reserve Design Using Spatially Explicit Annealing (Marxan) is software that provides decision support for the systematic design of conservation areas (Ball et al. 2009). The Marxan 240 analysis is based on specific principles that aid in identifying conservation areas with high value 241 242 in terms of sustainability and relatively low management costs. Marxan operates using a simulated annealing algorithm developed to achieve optimal results quickly through optimization 243 within its algorithm (Anggraeni et al. 2017). Many random changes to the protected area system 244 are attempted, typically one million or more. At the beginning of the annealing process, every 245 change in the score is accepted. As the process unfolds, the probability of accepting unfavorable 246 changes gradually decreases until only beneficial changes are accepted. Unfavorable changes are 247 those that increase the objective function score, while beneficial changes are those that decrease 248 the score (Moilanen and Ball, 2009). This process allows the algorithm to find a solution 249 approximating the exact solution (Watts et al. 2017). The optimal results indicate the lowest total 250 251 cost that operates with the following equation (Watts et al. 2017):

252

253 
$$Total\ Cost = \sum_{i=1}^{n} Cost + \left(BLM\ x \sum Boundary\right) + \sum_{i=1}^{n} (SPF\ x\ Penalty)$$

254 255

256

- : The combination of socio-economic values in each planning unit within the selected solution.
- 257 BLM: Values set by the user and related to the level of connectivity between planning units.
- 258 The higher the Boundary Length value, the denser the solution area.
- 259 Boundary: The boundary of the selected area.
- : Values set by the user and related to the importance of biodiversity target objectives. 260
- 261 The higher the SPF assigned to a feature, Marxan will prioritize that feature in the solution.
- Penalty: Penalty value assigned if biodiversity protection targets are not achieved (optional). 262
- : Unit ID in the shapefile. 263
- : Last Unit ID in the shapefile. 264 n

265

- 266 Boundary length in the protected area system is measured as the number of planning units that
- border planning units outside the protected area system. Therefore, a fragmented protected area 267
- system will have a considerable boundary length. Modifying the boundary length or Boundary 268
- 269 Length Modifier (BLM) aims to address connectivity issues by assigning a value to the
- 270 importance of a denser protected area system. BLM is crucial because a fragmented system will
- likely be difficult (and expensive) to manage (Watts et al. 2017). The Species Penalty Factor 271
- (SPF) is assigned for each conservation target and represents additional costs added to the total 272
- portfolio cost if conservation target objectives are unmet. Setting a high species penalty factor see Kim et al 2021) 273
- helps ensure that Marxan will achieve conservation target objectives (Geselbracht et al. 2009). In 274
- 275 Kim et al. (2021), SPF for bird species targets was set up to 100% to prioritize species
- conservation and minimize the number of unmet targets = 276





# **PeerJ**

2//	
278	Data and Scenario
279	The data used in this research is mainly from remote sensing as primary data and supported by
280	available secondary data (Table 1) and specification of multispectral bands of worldViews 3
281	image shows at Table 2. In the conservation planning process, targets denote the minimum
282	quantity or proportion of elements (such as vital habitats, species, processes, activities, and
283	distinct areas considered during the planning phase) within the planning region that should be
284	encompassed in the final plan. For instance, a target might be set to ensure 30% coverage of each
285	habitat type in the conservation system. Targets can be specified as a specific quantity (e.g.,
286	hectares of a particular habitat) or the number of occurrences (number of individuals) for each
287	feature emphasized in the reserve system. Biophysical parameters, including mangroves,
288	seagrass, and coral reefs, function as breeding grounds for numerous fish species that possess
289	both commercial value and ecological significance (Weeks 2017; Sutrisno, D et al. 2021). These
290	parameters are incorporated as integral conservation components.
291	
292	Table 1 Types and Sources of Data
293	Table 2 The multispectral bands of the WorldView-3 satellite imagery (Source : Choudhury et al.
294	2021)
295	Figure 2 Research Framework
296	
297	This research employs three different scenarios. Each scenario with conservation features will be
298	called "Ecological Value." The conservation features on Arefi Island consist of several
299	ecosystems, namely mangroves, seagrass, and coral reefs. Each of these features will be
300	protected and serve as the primary consideration in the spatial zoning design of the conservation
301	area according to the weight of each scenario parameter. The percentage weights for each
302	conservation feature in Ecological Value I, II, and III are 30%, 40%, and 50%, respectively
303	(Table 3). The International Union for Conservation of Nature (IUCN) considers these
304	percentages to be the best for sustainability. The cost characteristics found in Marxan inputs
305	signify the social, political, and operational challenges that hindered the selection of protected
306	zones. Allocating planning units for conservation actions is a part of the cost feature, and this
307	process relies on social data, which encompasses population figures, resource utilization patterns,
308	and area usage. Recognizing regions with distinctive local characteristics beyond conventional
309	policies is instrumental in shaping the spatial layout of marine conservation areas (Table 4). The
310	scenario with a combination of other percentage weights can be utilized; however, in this
311	research, only three scenarios are used.
312	
313	Table 3 Ecological Value of Conservation Zoning
314	Table 4 Cost Features
315	



316	This study considers the cost features of various human spatial utilization activities within the
317	conservation area. Penalty scores for each cost feature are assigned based on the level of
318	importance of the activity. The higher the penalty score assigned, the more difficult it is to
319	consider the activity area as a core zone. A penalty score of one represents activities such as
320	docks, floating net cages, and residential areas. Higher penalty scores are assigned to land use
321	activities. These scores are based on the difficulty of considering or releasing the area as a core
322	zone (Wijayanto, 2021).
323	zone (wijayamo, 2021).
324	Results
325	Satellite Image Analysis Results
326	The satellite image analysis using the OBIA method revealed three main coastal ecosystems in
327	Arefi Island. These coastal ecosystems are mangroves, seagrasses, and coral reefs (Fig. 3). These
328	three ecosystems are crucial coastal ecosystem components that contribute to conservation
329	sustainability. Mangrove, seagrass, and coral ecosystems play a significant role in coastal
<del>330</del>	protection against climate change, provide food, and serve as habitats for shelter, nursing, and
331	breeding (Carlson et al. 2021; Unsworth et al. 2019). The three ecosystems have
332	interrelationships that support each other. Mangroves and seagrasses control the release of
333	sediment from the land, reducing the impact of excessive sediment flows that could potentially
334	suffocate coral reefs (Golbuu et al. 2008). In return, mangroves are shielded from wave impact
335	and establish mutually beneficial biological connections with coral reefs. Therefore, the
336	existence of these three ecosystems must be preserved, and efforts should be made to minimize
337	degradation from anthropogenic activities.
338	
339	Figure 3 OBIA analysis of coastal ecosystems of Arefi Island, Raja Ampat, West Papua
340	
341	The total area of coastal ecosystems on Arefi Island is approximately 64.78 hectares (Table 5).
342	This area is predominantly covered by coral reefs, accounting for 45.41% of the total coverage.
343	Mangrove, seagrass, and coral reefs are scattered around Arefi Island while mangroves are
344	densely distributed southeast of Arefi Island. Mangroves are scarce in residential areas. Seagrass
345	beds coverage, making up 36.35% of the total, dominates the northern part of Arefi Island. The
346	presence of a port and floating fish cages indicates shipping, fishing, and tourism activities by
347	the local community.
348	
349	Table 5 Percentage coverage of coastal ecosystems using OBIA analysis.
350	
351	Conservation Priority Area Recommendations on Arefi Island
352	In three main scenarios, the buffer area is around 600 meters. This is based on the geographical
353	location of Arefi Island, where the farthest ecosystem extends to approximately 500 meters from
354	the island's coastline. To avoid bias in the study, the entire area of shallow marine habitats must
355	be included. From the analysis of the maps captured in Figure 4, three main areas emerge with



## Peer J

356 higher selection percentages, even in lower target scenarios. These areas are observed in the northern, southeastern, and southwestern waters of Arefi Island. The lack of selected areas for 357 conservation in the eastern part of Arefi Island's waters is evident. This may be due to a lower 358 level of biodiversity compared to other regions, justifying the absence of this area in the 359 360 solutions generated by Marxan. Another factor contributing to the absence of high-priority areas is the scarcity of data and cumulative impacts resulting from high anthropogenic activities in a 361 specific region (Fernandes et al. 2018). This factor occurs in the western and southern waters of 362 Arefi Island. Suspected tourism activities, shipping routes, and aquaculture practices, specifically 363 floating net systems, contribute to the scarcity of high-priority areas. 364

365 366

367

370

371

372

373

374

375

376

Figure 4 Conservation zones in Arefi Island with (a) Ecological Value I, (b) Ecological Value II, (c) Ecological Value III

368 369

The analysis of the zoning arrangements for the Arefi Island conservation area under three distinct Ecological Value scenarios reveals significant differences in spatial allocation aimed at optimizing conservation priorities, as seen in Table 6. Under Ecological Value I, the Core Zone, designated for the most stringent protection, covers 12.33 hectares or 2.27% of the total conservation area. Adjacent zones, including the Utilization Zone and Sustainable Fisheries Zone, constitute 1.62% and 3.68% of the area, respectively, indicating a prioritization strategy that leans towards a more inclusive use of the space while reserving the majority, 92.43%, for Other Zone, which may include general use areas with minimal restrictions. This arrangement totals 544.03 hectares, emphasizing a conservative approach to spatial designation.

377 378 379

380

381 382

383

384

385

Moving to Ecological Value II and III scenarios, there is a noticeable shift towards increased allocation for core conservation efforts. The Core Zone expands to 19.53 hectares (3.60%) and 34.37 hectares (6.32%) in scenarios II and III, respectively, reflecting a progressive enhancement in dedicated conservation spaces. Correspondingly, the Utilization and Sustainable Fisheries Zones undergo adjustments in their spatial allocations, with scenario III demonstrating a strategic reduction in these zones to bolster core conservation areas. This shift indicates a heightened emphasis on conservation, with the Other Zone area proportionately decreasing to accommodate the expanded Core Zone.

386 387 388

#### Table 6 Zoning arrangements for the Arefi Island conservation area

389 390

#### **Discussion**

391 This study carried out an overview of remote sensing techniques for biodiversity monitoring in 392 marine protected areas. It explores high-resolution satellite sensors and image analysis methods used to assess habitat types, species distributions, and ecological changes. The review highlights results? 393

the potential of satellite imagery for biodiversity assessment and emphasizes the importance of 394





395 integrating remote sensing data with ground-based observations for accurate monitoring, as explained by Petrou, Z.I. et al. (2015). 396 397 398 The parameters used vary depending on the geographic conditions of the existing region. Some 399 research commonly utilizes parameters such as coral reefs, seagrass beds, mangroves, biota migration routes, protected biota areas, turtle farming, shipping lanes, etc (Fernandes et al. 400 2018). The distribution descriptions of each parameter are provided in the study area. From this 401 research, it is evident that coral reefs, seagrass beds, and mangroves show significant results in 402 403 depicting the conservation area. Ecological Value: I use a target proportion (prop) of 30%. In the 404 Marxan setting, the prop will be adjusted to 0.3, meaning the conservation feature area within the planning units will be determined at 30%. The result of this scenario has a core zone area of 405 12.33 hectares or 2.27% of the total planned conservation area. This area does not yet meet the 406 ideal target for biota protection in the conservation area. According to Krueck et al. (2017), the 407 408 ideal area of coastal regions to be protected is 20-30% of the total coastal area. 409 410 The Marxan model was utilized to design conservation and utilization zone areas on Arefi Island. Marxan models operate systematically and are specifically designed to identify locations, plan, 411 412 and manage conservation areas comprehensively (Anggraeni et al. 2017). This model relies on 413 the static distribution of selected features, such as habitats, species distribution, or landscape types, to choose candidate features to achieve the desired conservation targets (Henriques et al. 414 2017). Marxan employs a more detailed and practical planning unit approach that optimally 415 integrates biodiversity considerations for sustainable conservation (Cheok et al. 2016). The current) 416 417 study found that employing a spatial planning model can identify optimal conservation priority zones within Arefi Island for local community use in the Marine Protected Area. Spatial 418 planning modeling integrates ecological data, habitat suitability assessments, and stakeholder 419 input to identify areas of high conservation value and vulnerability (Halpern et al. 2019). 420 421 Employing this approach would enhance the effectiveness of conservation measures and ensure the long-term sustainability of marine ecosystems in the Raja Ampat MPA. 422 423 424 Scenario Ecological Value II indicates that the protection target or conservation features will be 425 simulated to receive 40% protection for all ecosystems. The result of this scenario has a core 426 zone area of 19.53 hectares or 3.60% of the total planned conservation area. This area does not 427 yet meet the ideal target for biota protection in the conservation area. According to Krueck et al. 428 (2017), the ideal area of coastal regions to be protected is 20-30% of the total coastal area. 429 430 Scenario Ecological Value III indicates that the protection target or conservation features will be simulated to receive 50% protection for all ecosystems. The result of this scenario has a core 431 zone area of 34.37 hectares or 6.32% of the total planned conservation area. This area does not 432 433 yet meet the ideal target for biota protection in the conservation area. According to Krueck et al. 434 (2017), the ideal area of coastal regions to be protected is 20-30% of the total coastal area.



# **PeerJ**

435	
436	Of the three Ecological Values, the one that comes closest to the ideal scenario is Ecological
437	Value III, which has a core zone percentage of 6.32%. This requirement is part of the IUCN
438	conservation standards, aiming to safeguard 30% of crucial habitats within the region. It can
439	safeguard 20-30% of significant fish species at various trophic levels and disperse 30% of larvae
440	generated by these sites beyond the designated area. Based on Regulation of the Minister of
441	Marine Affairs and Fisheries No. 30 of 2010 Article 9 paragraph 3 concerning the zoning
442	management plan of conservation areas, it is stipulated that a core zone must be established for
443	each marine conservation area, coastal area, and small islands covering at least 2% (two percent)
444	of the total area. The establishment of this regulation indicates that all three scenarios of
445	Ecological Value meet the standard where the core zone area in each scenario exceeds 2% of the
446	total area. In other words, designing a conservation area requires scenario designs that consider
447	various conservation features and incorporate prop values (protection portions) into Marxan
448	according to management objectives.
449	
450	The outcomes of our analysis, particularly under Ecological Value Scenario II, highlight the
451	optimal balance between conservation imperatives and the potential for sustainable utilization.
452	This scenario, which allows for a higher degree of human activity within the designated areas
453	without compromising the overarching conservation goals, mirrors the findings of similar studies
454	that have sought to identify the sweet spot between ecological preservation and socioeconomic
455	development. For instance, a study by Nguyen et al. (2018) on the optimization of MPA design
456	for fisheries and biodiversity indicated that careful zoning could enhance marine resource stocks
457	while supporting local livelihoods. This resonance between our findings and Nguyen et al. 's
458	work underscores the efficacy of adaptive spatial planning in achieving multifaceted
459	conservation objectives.
460	
461	Moreover, the preferential outcomes associated with Ecological Value Scenario II, when
462	compared with other scenarios, corroborate the theory that not all conservation efforts need to
463	limit human activities to be strictly effective. This aligns with the principles outlined in the study
464	by Harris et al. (2019), which suggested that MPAs with mixed-use areas, when properly
465	managed, could contribute significantly to biodiversity conservation while simultaneously
466	providing economic benefits to local communities. This perspective challenges the traditional
467 460	conservation paradigm that often advocates for strict no-take zones, suggesting that a nuanced
468	approach, as demonstrated in our scenario II, can yield significant ecological and socioeconomic
469 470	benefits.
470 471	The juxtenesition of our geometric II regults with these studies not only validates our restled delays
471 472	The juxtaposition of our scenario II results with these studies not only validates our methodology
472 473	but also contributes to the ongoing dialogue on sustainable conservation practices. It highlights the necessity of incorporating local socio-economic realities into conservation planning, ensuring
473 474	that MPAs serve both as bastions of biodiversity and as sources of sustainable development.
<b>⊤/</b> →	mativit As serve both as bashons of blodiversity and as sources of sustainable development.

Such comparisons are invaluable for refining future conservation strategies, suggesting that further research should explore the integration of ecological and socio-economic data more deeply. This approach will enhance the understanding of the complex interplay between conservation areas and human communities, paving the way for more inclusive and effective conservation solutions.

Comparing the results of this study with previous research highlights both advancements in conservation planning methodologies and the critical need for refined spatial analysis in marine protected areas (MPAs). For instance, a study by Jones et al. (2016) on MPA design and effectiveness pointed out the crucial role of incorporating ecological and social data to achieve both biodiversity conservation and community benefits. While Jones et al. emphasized the integration of socio-economic factors, our study primarily focused on Ecological Values and their spatial distribution. This difference underscores the importance of a holistic approach that balances ecological integrity with human well-being, suggesting that future studies should include more comprehensive socio-economic analyses to align conservation efforts with community needs and aspirations.

A notable limitation of this research is the reliance on static ecological data, which may not fully capture the dynamic nature of marine ecosystems and their responses to climate change and human activities. The spatial resolution and temporal scope of the data, while sufficient for initial zoning and scenario planning, might not reflect subtle but significant ecological shifts over time. Additionally, the Marxan tool, despite its robustness in conservation planning, has constraints in modeling complex human-environment interactions, highlighting the need for integrating more adaptive and participatory planning tools that can accommodate changing ecological and social landscapes.

Future studies should aim to address these limitations by incorporating dynamic environmental modeling that accounts for climate change scenarios, habitat migration, and other ecological shifts. The inclusion of longitudinal community engagement and socio-economic data will enrich the conservation planning process, making it more responsive to the needs and values of local populations. Moreover, the exploration of innovative technologies, such as machine learning and artificial intelligence, could offer new insights into optimizing MPA design and management. These advancements will not only enhance the effectiveness of conservation zones but also contribute to the global knowledge base on sustainable marine resource management, ensuring the protection of biodiversity while supporting the livelihoods of dependent communities.

#### Conclusions

The outcomes of our analysis, particularly under Ecological Value Scenario II, highlight the optimal balance between conservation imperatives and the potential for sustainable utilization. This scenario, which allows for a higher degree of human activity within the designated areas



- without compromising the overarching conservation goals, mirrors the findings of similar studies
- that have sought to identify the sweet spot between ecological preservation and socioeconomic
- development. For instance, a study by Nguyen et al. (2018) on optimizing MPA design for
- fisheries and biodiversity indicated that careful zoning could enhance marine resource stocks
- while supporting local livelihoods. This resonance between our findings and Nguyen et al. 's
- work underscores the efficacy of adaptive spatial planning in achieving multifaceted
- 521 conservation objectives.

522

- Moreover, the preferential outcomes associated with Ecological Value Scenario II, when
- compared with other scenarios, corroborate the theory that not all conservation efforts need to
- 525 limit human activities to be strictly effective. This aligns with the principles outlined in the study
- by Harris et al. (2019), which suggested that MPAs with mixed-use areas, when properly
- 527 managed, could contribute significantly to biodiversity conservation while simultaneously
- providing economic benefits to local communities. This perspective challenges the traditional
- conservation paradigm that often advocates for strict no-take zones, suggesting that a nuanced
- approach, as demonstrated in our scenario II, can yield significant ecological and socioeconomic
- 531 benefits.

532533

#### **Acknowledgements**

- This research is part of the research "Decision Support System for Biodiversity Evaluation in
- 535 OECM Potential Areas Managed by Communities Using Satellite Imagery," which was funded
- by the Decision Support System Prototype Based on Satellite Image Analysis Research Fund
- 537 (Batch 1) Fiscal Year 2024, National Research and Innovation Agency of Indonesia (Project No.:
- 538 B-11046/III.6/TK.01.00/11/2023).

539 540

#### References

- Agardy, T., et al. (2011). "Marine Spatial Planning: A Step-By-Step Approach Toward
- 542 Ecosystem-Based Management." Intergovernmental Oceanographic Commission and Man and
- 543 the Biosphere Programme.
- Allen, G. R., and Erdmann, M. V. (2012). "Reef Fishes of the East Indies." Tropical Reef
- 545 Research.
- 546 Amkieltiela, Handayani, C. N., Andradi-Brown, D. A., Ford, A. K., Beger, M., Hakim, A.,
- 547 Muenzel, D. K., ... and Ahmadia, G. N. (2022). The rapid expansion of Indonesia's marine
- protected area requires improvement in management effectiveness. *Marine Policy*, 146, 105257.
- 549 https://doi.org/10.1016/j.marpol.2022.105257
- Anggraeni, D, Handayani, C. N., Daniel, D, Wahyudi, A, Subarno, T, Afandy, Z, Firmansyah, F.
- 551 (2017). Determining zones of nine marine protected area in Sulawesi Tenggara Province.
- 552 *Coastal and Ocean Journal (COJ)*. 1(2): 53-62. https://doi.org/10.29244/COJ.1.2.53-62
- Ban, N. C., Adams, V. M., Almany, G. R., Ban, S., Cinner, J. E., McCook, L. J., ... and White,
- A. (2011). Designing, implementing and managing marine protected areas: Emerging trends and



- opportunities for coral reef nations. Journal of Experimental Marine Biology and Ecology,
- 556 408(1-2), 21-31. https://doi.org/10.1016/j.jembe.2011.07.023
- Ball, I. R., Possingham, H. P., and Watts, M. (2009). Marxan and relatives: software for spatial
- 558 conservation prioritisation. Spatial conservation prioritisation: Quantitative methods and
- 559 computational tools, 14, 185-196. https://hdl.handle.net/1959.11/20240
- Belgiu, M., and Csillik, O. (2018). Sentinel-2 cropland mapping using pixel-based and object-
- based time-weighted dynamic time warping analysis. Remote sensing of environment, 204, 509-
- 562 523. https://doi.org/10.1016/j.rse.2017.10.005
- Cao, J., Leng, W., Liu, K., Liu, L., He, Z., and Zhu, Y. (2018). Object-based mangrove species
- classification using unmanned aerial vehicle hyperspectral images and digital surface models.
- 565 Remote Sensing, 10(1), 89. https://doi.org/10.3390/rs10010089
- 566 Carlson, R. R., Evans, L. J., Foo, S. A., Grady, B. W., Li, J., Seeley, M., ... and Asner, G. P.
- 567 (2021). Synergistic benefits of conserving land-sea ecosystems. Global Ecology and
- 568 Conservation, 28, e01684. https://doi.org/10.1016/j.gecco.2021.e01684
- 569 Cheok, J., Pressey, R. L., Weeks, R., Andréfouët, S., and Moloney, J. (2016). Sympathy for the
- 570 devil: detailing the effects of planning-unit size, thematic resolution of reef classes, and
- 571 socioeconomic costs on spatial priorities for marine conservation. *PLoS One*, 11(11), e0164869.
- 572 https://doi.org/10.1371/journal.pone.0164869
- 573 Choudhury, M. A. M., Marcheggiani, E., Galli, A., Modica, G., and Somers, B. (2021). Mapping
- the urban atmospheric carbon stock by lidar and worldview-3 data. Forests, 12(6), 692.
- 575 https://doi.org/10.3390/f12060692
- 576 Claudet, J., et al. (2020). "A Roadmap for Using the UN Decade of Ocean Science for
- 577 Sustainable Development in Support of Science, Policy, and Action." One Earth, 2(1), 34-42.
- 578 https://doi.org/10.1016/j.oneear.2019.10.012
- 579 Cinner, J. E., et al. (2018). "Bright Spots among the World's Coral Reefs." Nature, 535(7612),
- 580 416-419. https://doi.org/10.1038/nature18607
- Darmawan, M., Sutrisno, D., Agus, S. B., Nahid, I., Rudiastuti, A. W., Suryanta, J., and
- Sangadji, M. S. (2022, November). Salt pond detection on Sentinel 2 Satellite Imagery using
- 583 Object-Based Image Analysis (OBIA) Approach. In IOP Conference Series: Earth and
- 584 Environmental Science (Vol. 1109, No. 1, p. 012058). IOP Publishing. DOI: 10.1088/1755-
- 585 1315/1109/1/012058
- Estradivari, Agung, M. F., Adhuri, D. S., Ferse, S. C., Sualia, I., Andradi-Brown, D. A.,
- 587 Campbell, S. J., ... and Ahmadia, G. N. (2022). Marine conservation beyond MPAs: Towards the
- recognition of other effective area-based conservation measures (OECMs) in Indonesia. *Marine*
- 589 *Policy*, 137, 104939. https://doi.org/10.1016/j.marpol.2021.104939
- 590 Edgar, G. J., et al. (2014). "Global Conservation Outcomes Depend on Marine Protected Areas
- 591 with Five Key Features." Nature, 506(7487), 216-220. DOI:10.1038/nature13022
- 592 Fernandes, M. D.L, Quintela, A., and Alves, F. L. (2018). Identifying conservation priority areas
- 593 to inform maritime spatial planning: A new approach. Science of the Total Environment, 639,
- 594 1088-1098.



- 595 Geselbracht, L., Torres, R., Cumming, G. S., Dorfman, D., Beck, M., and Shaw, D. (2009).
- 596 Identification of a spatially efficient portfolio of priority conservation sites in marine and
- estuarine areas of Florida. Aquatic Conservation: Marine and Freshwater Ecosystems, 19(4),
- 598 408-420. https://doi.org/10.1002/aqc.992
- 599 Golbuu, Y., Fabricius, K., Victor, S., and Richmond, R. H. (2008). Gradients in coral reef
- 600 communities exposed to muddy river discharge in Pohnpei, Micronesia. Estuarine, Coastal and
- 601 Shelf Science, 76(1), 14-20. https://doi.org/10.1016/j.ecss.2007.06.005
- 602 Green, A., Smith, S. E., Lipsett-Moore, G., Groves, C., Peterson, N., Sheppard, S., ... and Bualia,
- 603 L. (2009). Designing a resilient network of marine protected areas for Kimbe Bay, Papua New
- 604 Guinea. Oryx, 43(4), 488-498. https://doi.org/10.1017/S0030605309990342
- 605 Gregory D. 2009. In situ preservation of marine archaeological sites: out of sight but not out of
- 606 mind. In: Richards, V., McKinnon, J. (Eds.), In Situ Conservation of Cultural Heritage: Public,
- Professionals and Preservation. Flinders University, Adelaide, pp. 1–16.
- Halpern, B. S., et al. (2019). "Spatial and Temporal Changes in Cumulative Human Impacts on
- the World's Ocean." Nature Communications, 10(1), 1-10. https://doi.org/10.1038/ncomms8615
- 610 Hossain, M. D., and Chen, D. (2019). Segmentation for Object-Based Image Analysis (OBIA): A
- 611 review of algorithms and challenges from remote sensing perspective. ISPRS Journal of
- Photogrammetry and Remote Sensing, 150, 115-134. <a href="https://doi.org/10.1016/j.isprsjprs">https://doi.org/10.1016/j.isprsjprs</a>.
- 613 2019.02.009
- Henriques, N. S., Monteiro, P., Bentes, L., Oliveira, F., Afonso, C. M. L., Goncalves, J. M. S.
- 615 (2017). Marxan as a zoning tool for development and economic purposed areas- aquaculture
- 616 management areas (AMAs). Ocean and Coastal Management. 141: 90-97.
- 617 dx.doi.org/10.1016/j.ocecoaman.2017.03.016
- 618 IUCN-WCPA (2008) Establishing Resilient Marine Protected Area Networks Making it Happen:
- 619 Full Technical Version, Including Ecological, Social and Governance Considerations, as Well as
- 620 Case Studies. IUCN.
- 621 [Kepmen KP] Keputusan Menteri Kelautan dan Perikanan Republik Indonesia Nomor 36 Tahun
- 622 2014 Tentang Kawasan Konservasi Perairan Kepulauan Raja Ampat Kabupaten Raja Ampat Di
- 623 Provinsi Papua Barat. 2017.
- 624 Kim, J. H., Park, S., Kim, S. H., and Lee, E. J. (2021). Identifying high-priority conservation
- areas for endangered waterbirds using a flagship species in the Korean DMZ. Ecological
- 626 Engineering, 159, 106080. https://doi.org/10.1016/j.ecoleng.2020.106080
- Krueck, N. C., Ahmadia, G. N., Possingham, H. P., Riginos, C., Treml, E. A., and Mumby, P. J.
- 628 (2017). Marine reserve targets to sustain and rebuild unregulated fisheries. *PLoS Biology*, 15(1),
- 629 e2000537. https://doi.org/10.1371/journal.pbio.2000537
- 630 Marcos, C., Díaz, D., Fietz, K., Forcada, A., Ford, A., García-Charton, J. A., ... and Pérez-
- Ruzafa, A. (2021). Reviewing the ecosystem services, societal goods, and benefits of marine
- protected areas. Frontiers in Marine Science, 8, 613819.
- 633 https://doi.org/10.3389/fmars.2021.613819



- 634 McKenna, Sheila and Allen, Gerald and Suryadi, Suer. (2002). A Marine Rapid Assessment of
- 635 the Raja Ampat Islands, Papua Province, Indonesia.
- 636 Moilanen, A., Ball, I. R. (2009). Heuristic and approximate optimization methods for spatial
- 637 conservation prioritization. In: Moilanen A, Wilson KA, Possingham HP (eds) Spatial
- 638 conservation prioritization: quantitative methods and computational tools. Oxford University
- 639 Press, Oxford.
- Mora, C., et al. (2019). "Spatial Patterns and Predictors of Trophic Overfishing: Implications for
- Marine Conservation." Royal Society Open Science, 6(3), 181216. DOI: 10.1111/ele.12481
- 642 [Permen KP] Peraturan Menteri Kelautan dan Perikanan Republik Indonesia Nomor 23 Tahun
- 643 2016 tentang Perencanaan Pengelolaan Wilayah Pesisir dan Pulau-Pulau Kecil. 2008.
- 644 [Permen KP] Peraturan Menteri Kelautan dan Perikanan Republik Indonesia Nomor 30 Tahun
- 645 2010 tentang Rencana Pengelolaan dan Zonasi Kawasan Konservasi Perairan. 2010.
- Petrou, Z.I., Manakos, I., Stathaki, T., 2015. Remote sensing for biodiversity monitoring: a
- 647 review of methods for biodiversity indicator extraction and assessment of progress towards
- 648 international targets. Biodivers Conserv (2015) 24:2333–2363. DOI 10.1007/s10531-015-0947-z
- 649 Sairiltiata, S. (2023). Eksistensi Sasi Perempuan Sebagai Kearifan Lokal Adat dan Budaya di
- Obesa Moning Pulau Wetar Kecamatan Wetar Timur Kabupaten Maluku Barat Daya. *Indonesia*
- 651 *Journal of Business Law*, 2(2), 47-57.
- 652 Stelzenmüller, V., Lee, J., South, A., Foden, J., and Rogers, S. I. (2013). Practical tools to
- support marine spatial planning: a review and some prototype tools. *Marine Policy*, 38, 214-227.
- 654 https://doi.org/10.1016/j.marpol.2012.05.038
- Sutrisno, D., Sugara, A., Darmawan, M. 2021. The Assessment of Coral Reefs Mapping
- 656 Methodology: An Integrated Method Approach. IOP Conference Series: Earth and
- 657 Environmental Science, 2021, 750(1), 012030. doi:10.1088/1755-1315/750/1/012030
- 658 Tan, Y., Xia, W., Xu, B., and Bai, L. (2018). Multi-feature classification approach for high
- 659 spatial resolution hyperspectral images. Journal of the Indian Society of Remote Sensing, 46, 9-
- 660 17. https://doi.org/10.1007/s12524-017-0663-0
- Trip, E. D. L., et al. (2019). Protected Areas for Marine Megafauna: Aims and Missing Links.
- 662 Frontiers in Marine Science, 6, 558. https://doi.org/10.3389/fmars.2022.849927
- Unsworth, R. K., McKenzie, L. J., Collier, C. J., Cullen-Unsworth, L. C., Duarte, C. M., Eklöf, J.
- 664 S., ... and Nordlund, L. M. (2019). Global challenges for seagrass conservation. Ambio, 48, 801-
- 665 815. https://doi.org/10.1007/s13280-018-1115-y
- Ventura, D., Bonifazi, A., Gravina, M. F., Belluscio, A., Ardizzone, G. (2018). Mapping and
- classification of ecologically sensitive marine habitats using unmanned aerial vehicle (UAV)
- 668 imagery and object-based image analysis (OBIA). Remote Sensing. 10(9): 1-23.
- 669 https://doi.org/10.3390/rs10091331
- Watts, M. E., Stewart, R. R., Martin, T. G., Klein, C. J., Carwardine, J., and Possingham, H. P.
- 671 (2017). Systematic conservation planning with Marxan. Learning Landscape Ecology: A
- 672 Practical Guide to Concepts and Techniques, 211-227. https://doi.org/10.1007/978-1-4939-6374-
- 673 4 13



## **PeerJ**

674	White.	A. 7	Γ., ε	et al. (	(2018)	). Establishin	g a i	Research .	Agenda	for	Social-l	Ecolo	gical	Resili	ience	in

- 675 Marine Protected Areas. Coastal Management, 46(3), 153-168.
- 676 https://doi.org/10.1016/j.marpol.2012.12.026
- Weeks, R. (2017). Incorporating seascape connectivity in conservation p rioritisation. *PloS one*,
- 678 12(7), e0182396. https://doi.org/10.1371/journal.pone.0182396
- 679 Wijayanto, C. (2021). Evaluasi pencadangan kawasan konservasi sebagai upaya pengembangan
- 680 Kawasan Konservasi Perairan Daerah Sulawesi Tenggara [theses]- IPB University.
- 681

Study area map in Arefi Island, Raja Ampat District

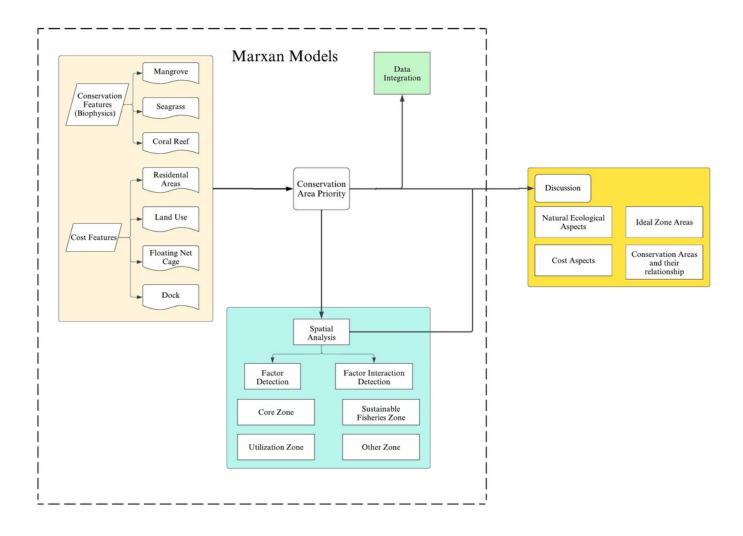
This research was conducted in Area III of marine Protected Area (MPA), Dampier Strait, Arefi Island, Raja Ampat 146 Regency, West Papua (Fig. 1). The Raja Ampat MPA in West Papua, Indonesia, encompasses a 147 vast and diverse marine ecosystem, including Arefi Island.





#### Research Framework

Figure 2 illustrates the flow of research carried out involving biophysical analysis of highresolution satellite data, spatial analysis using GIS applications, and Marxan models for zoning planning units and discussions.

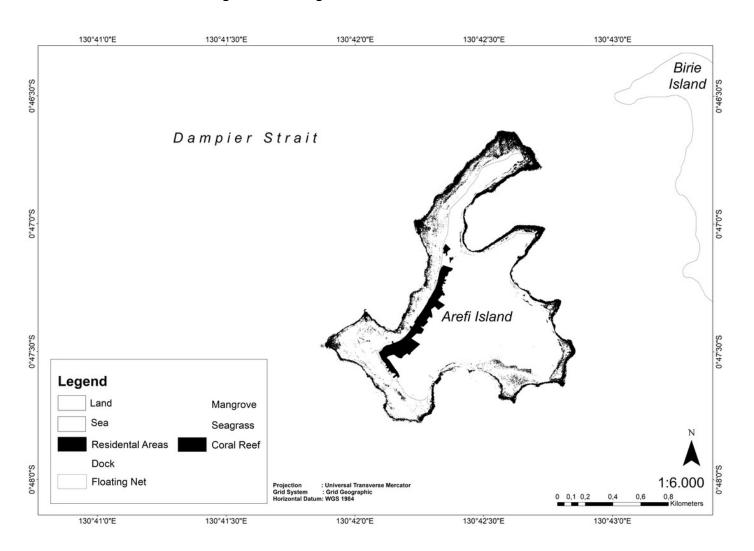




# Figure 3 📮

OBIA analysis of coastal ecosystems of Arefi Island, Raja Ampat, West Papua

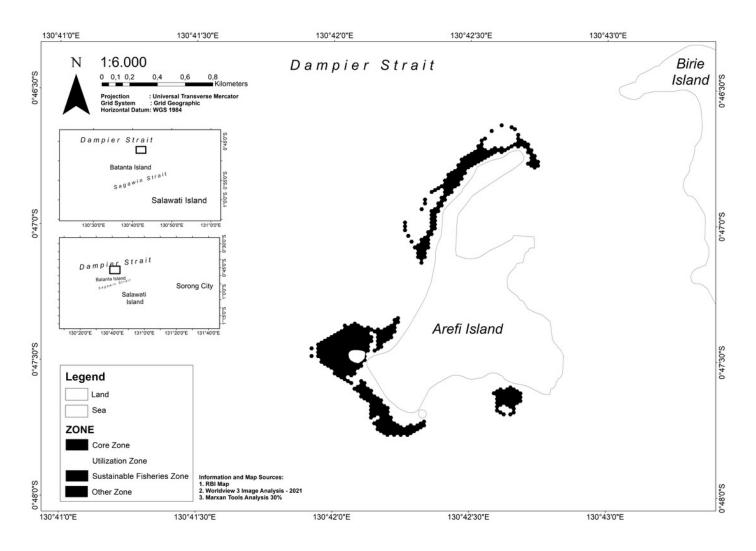
OBIA analysis of coastal ecosystems of Arefi Island, Raja Ampat, West Papua from satellite worldview 3 data for mangroves, sea grass and coral reefs





Conservation zones in Arefi Island with Ecological Value I

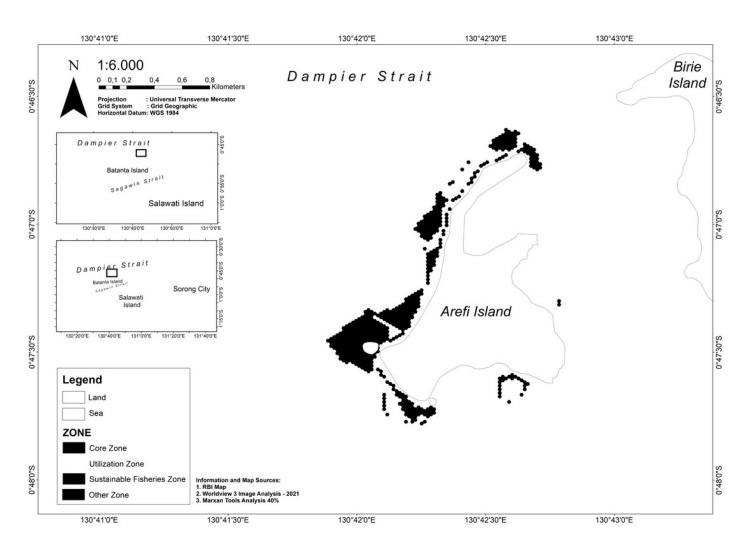
results of spatial analysis and zoning models for conservation zones in Arefi Island with (a) Ecological Value I, (b) Ecological Value II, (c) Ecological Value III





Conservation zones in Arefi Island with Ecological Value II

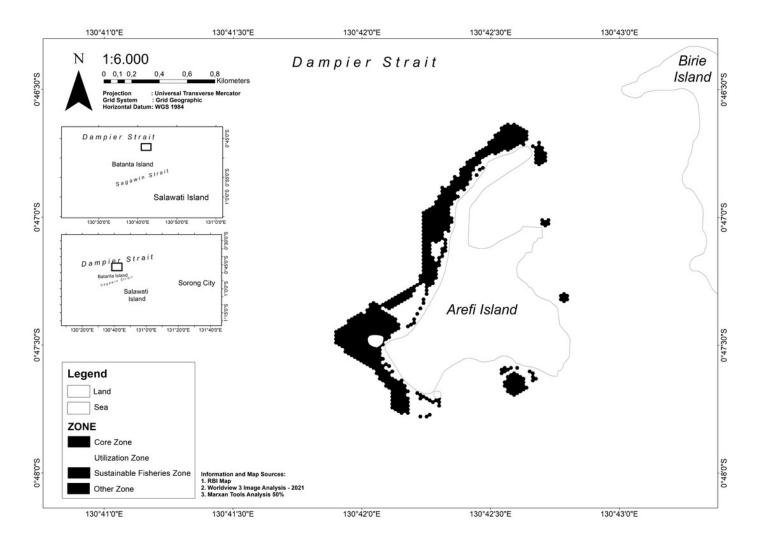
results of spatial analysis and zoning models for conservation zones in Arefi Island with (a) Ecological Value I, (b) Ecological Value II, (c) Ecological Value III





Conservation zones in Arefi Island with Ecological Value III

Results of spatial analysis and zoning models for conservation zones in Arefi Island with (a) Ecological Value I, (b) Ecological Value II, (c) Ecological Value III





## Table 1(on next page)

The multispectral bands of the WorldView-3 satellite imagery

The multispectral bands of the WorldView-3 satellite imagery (source: Choudhury et al. 2021)

# **PeerJ**

Table 1 Types and Sources of Data

Type of Data	Data	Resolution	Source
Primary	Worldview 3	0.6 meter	BRIN
Data	Image		
	Base Map	1: 10.000	BIG
Secondary	Mangrove Map	1: 25.000	BIG
Data	MPA Map	-	Kepmen KP 2016

2



## Table 2(on next page)

The multispectral bands of the WorldView-3 satellite imagery

The multispectral bands of the WorldView-3 satellite imagery (Source : Choudhury et al. 2021)

# **PeerJ**

Table 2 The multispectral bands of the WorldView-3 satellite imagery

Bands	Wavelength [nm]
Coastal band	400-450
Blue band	450-510
Green band	510-580
Yellow band	585-625
Red band	630-690
Red edge band	705-715
Near-Infrared one band	770-895
Near-Infrared two band	860-1040

Source : (Choudhury et al. 2021)



## Table 3(on next page)

**Ecological Value of Conservation Zoning** 

This research employs three different scenarios. Each scenario with conservation zone features will be called "Ecological Value."

 Table 3 Ecological Value of Conservation Zoning

Features	Е	cological Va	lue
	I	II	III
Coral Reef			
Seagrass	30%	40%	50%
Mangrove	_		

2 3



### Table 4(on next page)

#### Cost Feature

This study considers the cost features of various human spatial utilization activities within the conservation area. Penalty scores for each cost feature are assigned based on the level of importance of the activity.

# **PeerJ**

#### **Table 4** Cost Features

Cost Features				
Feature	Score			
Residential Areas	1			
Land use	3			
Floating Net Cage	1			
Dock	1			

2



#### **Table 5**(on next page)

Percentage coverage of coastal ecosystems using OBIA analysis

Table 5 shows the percentage of a coastal ecosystem from OBIA analysis. The total area of coastal ecosystems on Arefi Island is approximately 64.78 hectares (Table 5). This area is predominantly covered by coral reefs, accounting for 45.41% of the total coverage.

Mangrove, seagrass, and coral reefs are scattered around Arefi Island



Table 5 Percentage coverage of coastal ecosystems using OBIA analysis.

Classification	Areas (ha)	Percent to the area
		(%)
Coral reefs	23.55	45.41
Seagrass	29.42	36.35
Mangrove	11.81	18.24
Total	64.78	100

2



#### Table 6(on next page)

Zoning arrangements for the Arefi Island conservation area

Tabel 6 shows the analysis result of the zoning arrangements for the Arefi Island conservation area under three distinct ecological value scenarios for optimizing conservation priorities



1 Table 6 Zoning arrangements for the Arefi Island conservation area

Conservation	Zone	Areas (ha)	Percent to Area (%)
Area			
Ecological	Core Zone	12.33	2.27
Value I	Utilization Zone	8.83	1.62
	Sustainable Fisheries Zone	20.05	3.68
	Other Zone	502.82	92.43
	Total Per Area	544.03	100
Ecological	Core Zone	19.53	3.60
Value II	Utilization Zone	15.96	2.93
	Sustainable Fisheries Zone	15.67	2.88
	Other Zone	492.89	90.59
	Total Per Area	544.05	100
Ecological	Core Zone	34.37	6.32
Value III	Utilization Zone	11.92	2.19
	Sustainable Fisheries Zone	11.87	2.18
	Other Zone	485.87	89.31
	Total Per Area	544.03	100