

SCIENTIFIC DATA

OPEN

DATA DESCRIPTOR

A seafloor habitat map for the Australian continental shelf

Vanessa Lucieer¹, Neville Barrett¹, Claire Butler¹, Emma Flukes¹, Daniel Ierodiaconou², Tim Ingleton³, Alan Jordan⁴, Jacquomo Monk¹, Jessica Meeuwig⁵, Rick Porter-Smith¹, Neil Smit⁶, Peter Walsh¹, Alison Wright⁷ & Craig Johnson¹

Received: 19 February 2019

Accepted: 18 June 2019

Published online: 11 July 2019

Here we outline the genesis of Seamap Australia, which integrates spatial data of the seabed of Australia's continental shelf (0–200 m depth) from multiple sources to provide a single national map layer of marine habitat. It is underpinned by a hierarchical classification scheme with registered vocabulary, enabling presentation of nationally consistent information at the highest resolution available for any point in space. The Seamap Australia website enables users to delineate particular areas of interest, overlay habitat maps with many other marine data layers, and to directly access the data and metadata underlying the maps they produce. This unique resource represents a step-change in capacity to access and integrate large and diverse marine data holdings and to readily derive information and products to underpin decision making around marine spatial planning and conservation prioritisation, state-of-environment reporting, and research. It is a world first fully integrated national-scale marine mapping and data service.

Background & Summary

In the last decade the Australian government has invested significantly in the collection of seabed habitat data within coastal waters managed by state and territory governments, and offshore waters managed by the Commonwealth. This has resulted in government agencies and university researchers holding valuable spatial habitat and bathymetric data and associated products on different databases. The need to assimilate these data in a consistent manner and allow the public access to them is important for spatial marine planning, resource assessment (fisheries and minerals), offshore construction and exploration, and marine biodiversity assessment. However, whilst the level of interest in and need for these datasets has grown significantly in recent years, no national service to deliver these data has existed. The variation in classification schemes, data formats and metadata schemas are a reflection of limited national coordinated effort in curating these valuable data.

The goal of Seamap Australia is to demonstrate how the creation of an open source database system serving useful data products could be of national environmental significance. This product is being used to help develop a national marine monitoring strategy, to elucidate the conservation value of a set of Key Ecological Features (KEFs) (namely shelf reefs) and provide an annual inventory of benthic marine habitats and their spatial distribution within the Australian Marine Parks (AMPs). Seamap Australia has brought the Australian marine community together to create the first seafloor habitat map for the nation. The successful outcomes include: (a) the collation of all available national seabed habitat data into one location on the Australian Online Data Network (AODN) data portal, including associated metadata records; (b) the synthesis of these datasets into one spatial data product implementing a nationally ratified seabed classification scheme for the Australian continental shelf¹; and (c) visualisation of these data with the capacity to subset and download via a web interface (www.seamapaustalia.org).

¹Institute for Marine and Antarctic Studies, University of Tasmania, Private Bag 129, Hobart, Tasmania, 7001, Australia. ²School of Life and Environmental Sciences, Faculty of Science, Engineering and Built Environment, Deakin University, Princes Hwy, Sherwood Park, Warrnambool, Victoria, 3280, Australia. ³NSW Office of Environment and Heritage (OEH), 59–61 Goulburn Street, Sydney, 2001, Australia. ⁴NSW Department of Primary Industries (DPI) Port Stephens Fisheries Institute, Locked Bag 1, Nelson, Bay New South Wales, 2315, Australia. ⁵School of Biological Sciences, University of Western Australia, 35 Stirling Highway, Crawley, 6008, Australia. ⁶Department of Environment and Natural Resources (DENR), Northern Territory Government, PO Box 496, Northern Territory, 0831, Australia. ⁷Evaluation and Ecological Science Unit, Science Group, Department of Environment, Water and Natural Resources, Level 7, 81 Waymouth Street, Adelaide, South Australia, 5001, Australia. Correspondence and requests for materials should be addressed to V.L. (email: vanessa.lucieer@utas.edu.au)

Seamap Australia represents the integration of several different research programs conducted over the past few years in Australia. The National Environmental Science Program's Marine Biodiversity Hub in 2016 commissioned a project through its research theme 'Understanding biophysical, economic and social aspects of the marine environment' to develop a nationwide spatial dataset of reef habitat on the continental shelf². The Shelf Reef Key Ecological Features (SRKEF) project initiated the first nationwide collaboration with the aim to encourage benthic data custodians from major government institutions (Geoscience Australia, CSIRO) and universities to make their data available under a Creative Commons license and discoverable through the AODN. This project, the first national-scale collation of benthic habitat data, made significant inroads towards building collaborative relationships and commitment across agencies to share habitat mapping data for public good. It raised awareness of the benefits of working together as a community to achieve a goal that would permit marine science questions to be addressed at a national scale. The report detailed a number of recommendations related to the need for data standards, central data storage, and tools for data visualization. Seamap Australia met the challenges of these recommendations with the support of funding from the Australian National Data Service (ANDS)¹.

Seamap Australia benefited from a few significant advances from the SRKEF project, foremost being the identification of knowledge gaps in marine seafloor survey data on the continental shelf within the 0–200 m depth range. This first report revealed that only ~15% of the Australian continental shelf had been surveyed for *bathymetry* alone².

Here we present the Seamap Australia data layer, i.e. a map of the benthic marine habitats on the continental shelf with a nationally consistent hierarchical classification.

Methods

Designing a national classification system to standardise benthic classes. Classification is a means to group data into meaningful and consistent categories in support of mapping. In Australia, few attempts have been made to classify coastal and marine ecosystems at a national scale. One of the most widely used classifications involves the bioregionalisation of the Australian marine environment. Bioregionalisation divides the environment into large (3,000–240,000 km²) units characterised by broad natural features and environmental processes that influence the function of the entire ecosystem. The purpose of the Integrated Marine and Coastal Regionalisation of Australia (IMCRA 2006) was to aid in regional scale planning, management and conservation, however, this kind of information at such coarse spatial resolution is unable to define habitats or detect change or loss of communities³.

Mount and Bricher⁴ were the first to develop a national habitat classification scheme that focused on characterising units at a finer resolution (10¹–10³ m). They presented the National Intertidal Subtidal Benthic (NISB) Classification Scheme which defined broad habitat types in terms of substratum type and structural macrobiota (e.g. boulder, sand, rock, coral, seagrass, macroalgae) from the Highest Astronomical Tide (HAT) to the outer edge of the continental shelf (~200 m depth). The classification scheme was designed to be compatible with other schemes employed by mapping groups in Australia, however it was structured as an attribute-based system and so was not hierarchical⁴. It could therefore not account for the nested scales of different mapping initiatives and this may explain why it was not readily adopted by the Australian seabed mapping community. A hierarchical system allows data for any particular point to be presented in the highest available resolution, which might vary greatly from one point to another.

The development of habitat classification schemes at the state level has received more attention. Influenced by funding for marine habitat mapping through programs such as Natural Resource Management (NRM), or through local marine studies conducted by universities, there have been several projects nationwide. Significant effort by government and research agencies in Western Australia, South Australia, New South Wales, Tasmania and Victoria has seen the development of individual classifications in each area^{5–8}. However, it is not currently possible to compare the distribution of habitats between state waters due to inconsistencies in classification classes and differences in the primary focus of the schemes (e.g. abiotic vs. biotic).

Each system had been developed to meet a different purpose, and data were collected using different technologies (acoustic single beam, multibeam sonar, light detection and ranging, aerial photography, video, or autonomous underwater vehicle). The technology employed for data collection has been the determining factor in influencing how the classification is derived and structured. As noted by Butler, *et al.*⁹ there is no single best way to classify habitats, and the most appropriate structure will depend on the project objectives (e.g. conservation, resource evaluation, environmental impact or biodiversity assessment), and in some cases the technology used in data collection (e.g. remote sensing *vs in situ* methods). The consequence is that, although multiple different classification approaches may be valid, existing classifications do not often align among states, territories, and regions.

Generating reef data layers for the Shelf Reef Key Ecological Features (SRKEF) project. Seamap Australia built onto the mapping initiative that was established by the SRKEF. When providing their data, many collaborators not only made their reef data layers publicly available but also uploaded to AODN their full habitat mapping database. Where habitat data had not been extracted, bathymetric data alone was assessed qualitatively for its accuracy, scale and suitability to generate reef data layers. To differentiate between complete benthic habitat shapefiles and derived benthic habitat classes from bathymetric data, a system of four tiers based on source data was established. Each tier represents the different data processing conducted to extract the reef class and level of synthesis to develop the final reef spatial product within SRKEF (see² for additional methods on data processing). Tier 1 represented reef habitat which had been directly sampled and validated using a field validation method such as video data. Many research agencies made their fully classified habitat data available through the AODN where the reef product could be easily extracted. Tiers 2 and 4 data were data products where reef habitat was modelled but not validated (Tier 2 CSIRO data holdings, Tier 4 AHO data holdings). Tier 3 data represented the

AHO S57 data where labelled attributes such as shoals or *awashed* rocks might allude to the seafloor being composed primarily of consolidated reef-like substrata. These data were from a diversity of sources:

1. TIER 1 reef shapefiles were sourced from seafloor mapping programs completed around the nation predominantly by state-based agencies. These mapped reef data represent the highest quality mapping data, with reef extents being validated through ground truthing.
2. TIER 2 data were generated from the collation and reprocessing of CSIRO's acoustic bathymetric data holdings on the continental shelf. A bathymetric analysis was used to identify high slope regions, which were interpreted as probable, but unvalidated, reef.
3. TIER 3 data involved the extraction of reef features from the AHO S57 maps. A number of AHO S57 attributes (see Lucieer²) were extracted based on their relevance where the attribute alluded to a potential reef. The AHO's definition of a reef pertains to whether the feature is a danger to navigation and shipping, and therefore this habitat definition differs to the SRKEF classification of reef. It should be noted that any raised features in the AHO data could possibly be a reef even though not labelled as such.
4. TIER 4 indicates the probability of a reef being present based on a bathymetric analysis of the AHO S57 data layers on the continental shelf using the methodology applied to TIER 2 (see Lucieer²).

Standardizing the nation's seafloor classes in Seamap Australia. Benthic habitat data in shapefile format was collected from several different providers (Online-only Table 1). These original datasets came from surveys conducted over varying temporal and spatial scales and employed a variety of methods, including acoustic sampling, diver surveys, benthic trawls, aerial photography, grab samples, underwater video, single- and multibeam sounding, satellite imagery, and drop cameras (information contained within the Seamap Australia dataset, columns *Method_Br* and *Method_F*; Online-only Table 2). Seamap Australia did not discriminate among data based on data collection type, but in the interests of full national coverage permitted all data from different technologies to be amalgamated into the process.

The Seamap Australia benthic habitat classification scheme was used to reclassify all shapefiles whilst maintaining the original (source) classification in the attribute table. Typically, this was applied to a single classification column in the source dataset, but in some cases interrogation of multiple levels of classification was necessary (e.g. if both biotic and physical attributes were recorded in the source data). Source datasets were broadly grouped into Commonwealth or state-based data, and spatial overlaps were identified. In most cases, priority was assigned to the most recent surveys conducted within a region, except where older surveys provided significantly greater classification detail, or were captured at a higher spatial resolution. Consideration was also given to the accuracy of the collection methodology used, and level of confidence in the data (based on coverage of the technology employed).

Source datasets were combined into a single national-scale benthic habitat layer based on layer priority using a combination of desktop GIS software operations (Erase, Merge and Union, ArcMAP VERSION 10.2.1). Where both biotic and physical classifications were available for a single region, classifications from both datasets were retained (see *Hab_ORIG* column) and both a Biotic Classification (BC) and Substratum Classification (SC) were permitted through the hierarchical structure of the Seamap Australia national benthic habitat classification table (Butler *et al.* 2017). In cases where the Seamap Australia classification was obtained from two datasets, it is indicated in the *Data_ORIG* column.

The national benthic habitat layer was further spatially classified into two hierarchical Biogeographic Settings that partition the marine environment according to broad-scale Marine Ecoregions of the World Realm, Province, and Ecoregion (*MEOW_Realm*, *MEOW_Prov* and *MEOW_Eco*, respectively), and finer-scale Integrated Marine and Coastal Regionalisation of Australia (v4.0)¹⁰, Provincial Bioregion, and Meso-scale Bioregion (*IMCRA_Prov* and *IMCRA_Bio*)¹¹. Where data fell outside the spatial boundaries defined by the IMCRA bioregionalisations, this is shown in the data using the convention [extended inshore] or [extended offshore] to indicate proximity to the nearest IMCRA classified region. Data were assigned an Aquatic Setting using the Geoscience Australia classification for estuarine and coastal waterways based on the spatial relationship with the Geoscience Australia "Oz Estuaries 100k" dataset¹². Where the Oz Estuaries source dataset identifies an estuarine or delta habitat, the Seamap Australia *AS_System* was defined as Coastal Waterway. Nearshore and Offshore Aquatic Subsystems (*AS_SubSys*) were distinguished using the 30 m depth contour (sourced from Geoscience Australia), with Tidal Zone (*AS_TidalZ*) further classified using the Lowest Astronomical Tide (LAT) and Highest Astronomical Tide (HAT) (as defined by PCTMSL 2014). Finally, data were assigned to Benthic Depth Zones (*AS_BDepth*) according to tidal influence and photic zone (for further information on data processing in this section please refer to Butler *et al.* 2016). The ArcGIS 'Identity' tool was used for classification of all Aquatic and Biogeographic settings, and a 'Generate Near Table' was used to classify data that did not intersect with the IMCRA regions.

A small amount of polygon boundary and size simplification was necessary to reduce file size and optimise usability of the national benthic habitat layer. These steps involved (1) snapping vertices to 5 m tolerance (high resolution multibeam data only); (2) eliminating polygons with an area < 50 m² (based on longest adjacent border); and (3) removing polygons with area < 20 m² not previously detected by the elimination step (i.e. small "islands" not touching adjacent polygons). This was not applied to 'source data' of a minimum size such as seagrass, mangrove and saltmarsh layers, which typically have a small area coverage, only to 'sliver' created when data sets were merged and the overlapped. The data were then dissolved (ArcMAP 'Dissolve' tool) based on common attributes listed in Online-only Table 2 with the aim to further reduce filesize of the national benthic habitat layer without degrading the spatial accuracy and resolution of the data. Source datasets, available from the Seamap Australia website, retain the original spatial detail. Figure 1 outlines the data processing workflow.

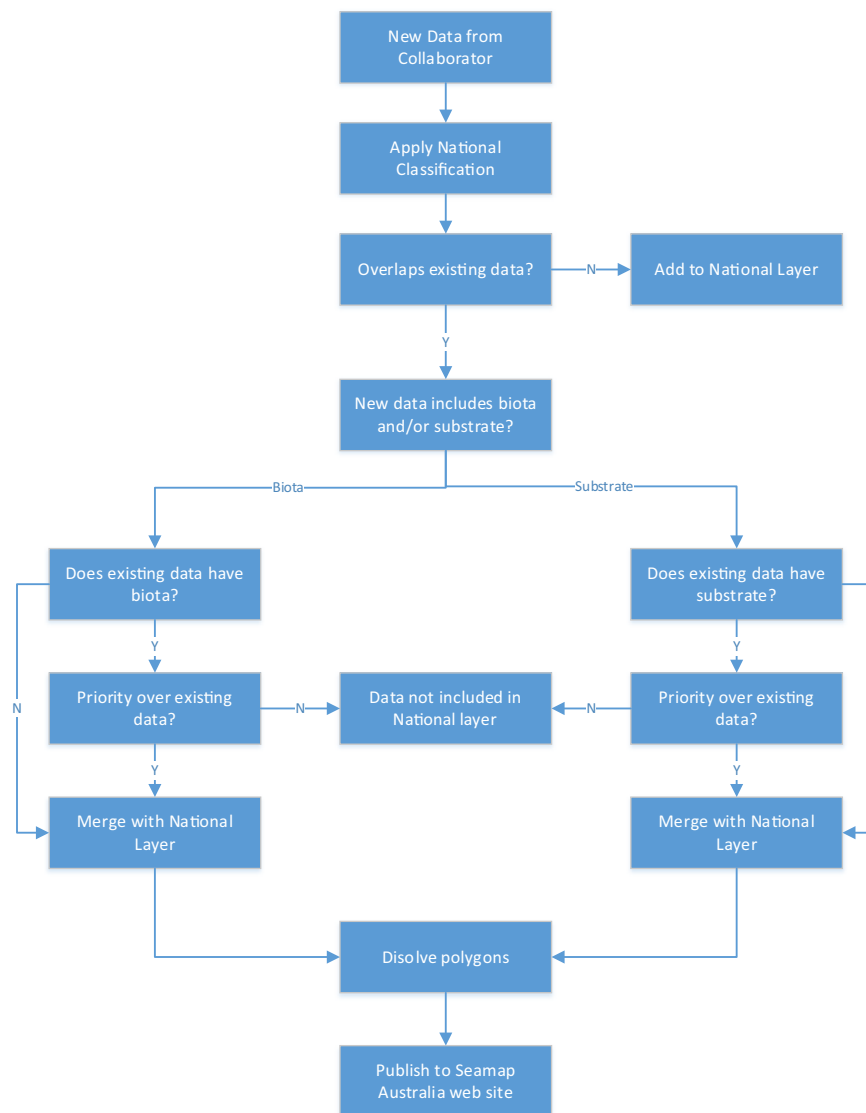


Fig. 1 Seamap Australia data processing workflow.

Data Records

Data Record 1: The Seamap Australia national seafloor habitat dataset is stored in a SQL Server database which is updated over time as new data becomes available. It is made available for download via Open Geospatial Consortium (OGC) Web Feature Service (WFS) in Shapefile format (.shp), or CSV (with geometry objects Well Known Text format) through either the IMAS Data Portal or IMAS Metadata Catalogue. Additionally, the data can be directly accessed by connecting to the IMAS WFS¹³ using desktop GIS software. A geospatial visualisation of the data is provided through an OGC Web Mapping Service (WMS) and can be viewed in the IMAS Data Portal. Metadata describing the data collection is stored in the IMAS Metadata Catalogue. The data is available for users to download in Shapefile format (.shp), or CSV (with geometry objects text format) through either the IMAS Data Portal or IMAS Metadata Catalogue.

Each record in the dataset describes an area of seafloor habitat and includes a spatial component, data source information, national classification hierarchy, source data classification and bioregion details (Online-only Table 2). Individual classifications are not limited to a single record, therefore may be repeated multiple times in the dataset.

We recommend using this data record over Data Record 2 described below for the most accurate and current version of the data.

Data Record 2: An archived version of the Seamap Australia national seafloor habitat dataset exists as a ‘snapshot’ of the data at the time of publication. Data access is through the IMAS data repository¹³ and field definitions are the same as described for Data Record 1 above. Figure 2 highlights an example of the range of marine habitats as shown on the web portal map service.

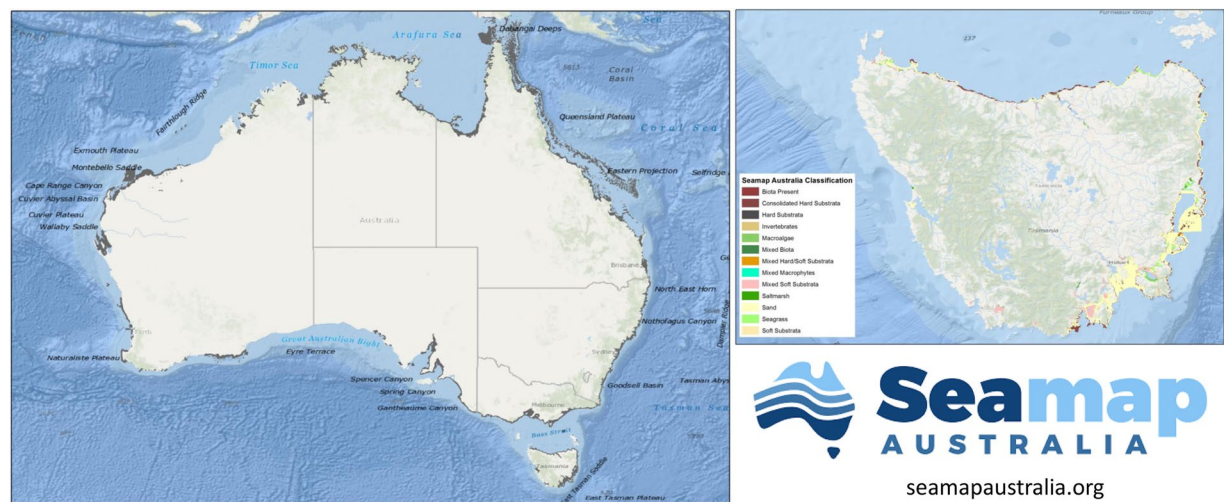


Fig. 2 Benthic marine habitats on the Australian shelf. The coverage of Seamap Australia (grey polygons indicate extent of V1 data release. Map of Tasmania showing the habitats classified using the Seamap Australia classification scheme.

Comparison	Definition
=	There is a 1:1 relationship between source unit and candidate unit. Unit names may differ.
□	The source unit is almost equivalent to the candidate unit - there may be small threshold or concept differences.
>	The source unit is more broadly defined than the candidate unit. The threshold of the source unit may be higher or the concept broader, and the source unit fully contains the candidate unit.
<	The source unit is more finely defined than the candidate unit. The threshold of the source unit may be lower or the concept narrower, and the source unit is fully contained within the candidate unit.
><	The source unit is neither clearly broader nor finer than the candidate unit. Both units contain at least one common entity and each contains at least one entity that the other does not. Neither concept is fully contained within the other.
<>	The source unit does not have a clearly related unit in the candidate classification
?	The relationship between the source and candidate unit is unknown

Table 1. Definitions for the comparisons used to assess the suitability of candidate scheme structures and class definitions for development of the Seamap Australia Benthic Marine Classification Scheme.

Technical Validation

Benthic marine classification schemes in use internationally were investigated to assess both the suitability and applicability of their structure and class units to the aims of the Seamap Australia National Benthic Marine Habitat Classification Scheme.

Schemes considered include the Coastal Marine Ecological Classification Scheme (CMECS¹⁴), the European Nature Information System (EUNIS¹⁵) classification, the Coastal Marine Classification for New Zealand¹⁶, and the British Columbia Marine Ecological Classification¹⁷.

The assessment was made through a review of each scheme in an Australian context. To aid in assessing the utility of each scheme, a classification crosswalk was performed between existing datasets and the candidate scheme in question. This involved passing classified units in the existing datasets through each of the above schemes as far as was possible using the information provided with the original classification. A comparison was made that related the resolution and accuracy of the original class to that of the ‘new’ class attributed in the candidate scheme. This procedure followed the guidelines for comparing classification systems outlined in the Federal Geographic Data Committee report¹⁸ (Table 1). It allowed evaluation of each original classification term and enabled identifying the different aspects of each scheme that were suitable for reclassification and those that were not.

Based on these definitions, the habitat classification model that was deemed the most suitable and broadly applicable was selected and reviewed with the aim of adopting it to form the foundation of the Seamap Australia Benthic Marine Habitat Classification Scheme.

Adaptations from the original scheme were deemed necessary to ensure that the final Seamap Australia scheme was (a) relevant to Australian benthic habitats, (b) represented a true hierarchy with each class reached only through a single pathway, and (c) ensured that all major benthic marine habitats were included in a clear and logical framework. Adaptations were made based on the aforementioned schema, and also from the broader habitat mapping and classification literature. Changes to classes and class definitions throughout the process were minimised so that habitats classified under the different schema could still be compared.

Usage Notes

The ongoing benefits of the Seamap Australia classification scheme and spatial data product will facilitate national collaborations for benthic research, encourage a nationally consistent approach for Australian seabed mapping into the future, and have facilitated establishing a common seabed mapping vocabulary that has been registered nationally. We anticipate that Seamap Australia will facilitate national scale cross-disciplinary studies of continental shelf habitats. As the data resource grows into the future it will become more and more relevant to global ocean multidisciplinary research.

As the Seamap Australia habitat data layers become utilized in national benthic mapping studies, we hope that this will demonstrate the value of the current investment into this program. It is our intention to apply, in collaboration with the existing partners and with new partners, for additional funding once the spatial data has been utilized and feedbacks for improvement have been documented. In addition, it is pertinent to await at least 3 years between versions of Seamap Australia to allow for new surveys to be conducted, data processed, analyzed, classified and released as Open Data, ready for harvesting into Seamap Australia Version 2.

We advise that the Seamap Australia bathymetric or habitat spatial data layers are not to be used for seagoing navigation. The custodians of Seamap Australia at IMAS invite feedback on the utility of Seamap Australia in applications such as State-of-Environment reporting, national marine monitoring, and coastal process modelling.

Code Availability

No custom code was created for the generation of the Seamap Australia V1 dataset.

References

- Butler, C., Lucieer, V., Walsh, P., Flukes, E. & Johnson, C. *Seamap Australia (Version 1.0) the development of a national marine classification scheme for the Australian continental shelf*, 1–52 (University of Tasmania, 2017).
- Lucieer, V., Porter-Smith, R., Nichol, S., Monk, J. & Barrett, N. *Collation of existing shelf reef mapping data and gap identification*, 1–43 (Hobart Tasmania, 2016).
- O'Hara, T., Nichol, S., Przeslawski, R., Hedge, P. & Bax, N. *Towards an IMCRA* 5, 28 (2016).
- Mount, R. & Bricher, P. *Estuarine, Coastal and Marine National Habitat Map Series user guide.*, (Australian Government Department of Climate Change, National Land and Water Resources Audit., Hobart 1–156 2008).
- Edmunds, M. & Flynn, A. A Victorian Marine Biotope Classification Scheme. 1–105 (2015).
- Ferns, L. W. & Hough, D. *Environmental Inventory of Victoria's Marine Ecosystems Stage 3 (2nd Edition) – Understanding biodiversity representativeness of Victoria's rocky reefs*. Parks, Flora and Fauna Division. 1–156 (Department of Natural Resources and Environment, East Melbourne, Australia, 2000).
- Jordan, A. *et al.* In *Proceedings of the International Ocean Science Conference*. 1–6 (Sydney, Australia, 2010).
- Bancroft, K. A standardised classification scheme for the mapping of shallow-water marine habitats in Western Australia. 1–52 (Freemantle, Western Australia, 2003).
- Butler, A. *et al.* An Interim Bioregionalisation for the continental slope and deeper waters of the South-East Marine Region of Australia 1–34 (2001).
- Commonwealth of Australia. A Guide to the Integrated Marine and Coastal Regionalisation of Australia Version 4.0, 1–16 (Canberra, Australia, 2006).
- Australian Government Data Sources. (ed. ERIN Department of Environment and Heritage) (Australian Government, Australia, 2006).
- Heap, A. *et al.* *Australian Estuaries & Coastal Waterways: A Geoscience Perspective for Improved and Integrated Resource Management, A Report to the National Land & Water Resources Audit Theme 7: Ecosystem Health* 1–126 (2001).
- Lucieer, V. *Seamap Australia- National Seafloor Habitat V1.0 Institute for Marine and Antarctic Studies, University of Tasmania*, <https://doi.org/10.25959/5c06fc1beded6> (2018).
- Carollo, C., Allee, R. J. & Yoskowitz, D. W. Linking the Coastal and Marine Ecological Classification Standard (CMECS) to ecosystem services: an application to the US Gulf of Mexico. *International Journal of Biodiversity Science, Ecosystem Services & Management* 9, 249–256 (2013).
- Davies, C. E., Moss, D. & Hill, M. O. EUNIS habitat classification revised 2004. *Report to: European Environment Agency-European Topic Centre on Nature Protection and Biodiversity*, 127–143 (2004).
- Ministry of Fisheries and Department of Conservation. *Marine Protected Areas: Classification, protection standard and implementation guidelines*, 1–53 (Wellington, New Zealand, 2008).
- Roff, J. & Hines, E. British Columbia Marine Ecological Classification update 1–63 (2001).
- Federal Geographic Data Committee. Coastal and Marine Ecological Classification Standard. 1–353 (2012).

Acknowledgements

We wish to acknowledge Mark Hepburn from Condense for developing the Seamap Australia website and technical advice and assistance building the data services architecture. We wish to acknowledge the support of the Australian National Data Service [ANDS], the Institute for Marine and Antarctic Studies [IMAS], the Integrated Marine Observing System [IMOS], the Tasmanian Partnership for Advanced Computing [TPAC] and the NESF Marine Biodiversity Hub for making the Seamap Australia project possible.

Author Contributions

V.L., C.J., P.W. developed the research proposal with the Australian National Data Service to fund the Seamap Australia spatial data layer. P.W. and E.F. designed the database and web services architecture. E.F. was employed as a spatial data analyst and built the spatial database underlying Seamap Australia, collated, processed and optimised the data, configured web mapping and feature services and assisted with QA/QC processes. C.B. worked on the development of the national Seamap Australia classification scheme and synthesised the data layers into the scheme. N.B. was the Theme D leader of the marine biodiversity hub which funded the SRKEF project. V.L. was the project manager of the SRKEF project. R.P.S. collated and analysed the national bathymetric data layers for Tier 1, modelled reef distribution from AHO and CSIRO data records TIER 2 and TIER 3 and extracted the AHO relevant classes to produce TIER 4. J.M. assisted with additional data curation and spatial analysis to link the SRKEF and Seamap Australia projects together and adapted these data for other Marine Biodiversity Hub

projects. D.I., T.I., A.J., J.J.M., N.S., A.W. provided data holdings to the Seamap Australia and SRKEF projects and were involved in contributing and reviewing the Seamap Australia benthic habitat classification scheme.

Additional Information

Competing Interests: The authors declare no competing interests.

Publisher's note: Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

The Creative Commons Public Domain Dedication waiver <http://creativecommons.org/publicdomain/zero/1.0/> applies to the metadata files associated with this article.

© The Author(s) 2019