# A NEW MAP OF GLOBAL ECOLOGICAL MARINE UNITS AN ENVIRONMENTAL STRATIFICATION APPROACH















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# A New Map of Global Ecological Marine Units — **An Environmental Stratification Approach**

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#### Foreword

AAG is pleased to present another publication in a series of global ecosystem mapping efforts commissioned by the Group on Earth Observations (GEO), a consortium of over 100 nations advocating the use of earth observations to address some of society's most pressing challenges. The alteration and loss of ecosystems is one of those challenges, and increasing shortages of ecosystem goods and services so important for our survival and persistence on this planet are likely. Understanding the distributions and condition of global ecosystems will help us to manage them more sustainably. As an important first step in that direction, the USGS, Esri, and a steering committee of international marine scientists has produced a new map of global marine ecosystems, presented herein.

In 2014 USGS and Esri joined forces in a public/private partnership to map standardized, robust, and practical terrestrial ecosystems, called ecological land units (ELUs). Recognizing the groundbreaking nature and importance of that work, AAG produced a special publication, entitled "A New Map of Global Ecological Land Units - An Ecophysiographic Stratification Approach," and launched the resource at the 2015 AAG Annual Meeting. Continuing the collaboration, USGS and Esri then turned their attention to an ecological partitioning of the global ocean. This work is a first-of-its-kind mapping of marine ecosystems that is globally comprehensive, objectively produced, and three-dimensional from sea surface to seafloor. The ocean was subdivided into 37 chemically and physically distinct volumetric regions called ecological marine units (EMUs), a marine ecosystem analog to the terrestrial ELUs. AAG offers this work as a companion document to the ELU booklet, and considers it the second in an emerging series of global ecosystem mapping characterizations.

The work was co-led by Dr. Roger Sayre, an Ecosystems Geographer at USGS; Dr. Dawn Wright, Esri's Chief Scientist; and Sean Breyer, Esri's Living Atlas of the World Program Manager. Other Esri staff contributed significant statistical support (Dr. Kevin Butler) and geospatial data development and analysis (Keith VanGraafeiland). The Esri team was very giving of their time and expertise, and that support was courtesy of the vision and generosity of Esri's founder and CEO Jack Dangermond, a life-long supporter of the AAG.

Douglas Richardson **Executive Director** American Association of Geographers

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Figure 2. Global ecological land units (ELUs) produced from an ecophysiographic stratification of the terrestrial environment by climate region, landform type, lithology, and land cover (Sayre et al., 2014). The terrestrial ELUs were developed in response to a commission from the Group on Earth Observations (GEO) to produce a standardized, robust, and practical global ecosystems map for terrestrial environments.

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Figure 4. A 2D representation of EMUs occurring at a depth of 1000 m. On land, the terrestrial ecological land units (ELUs) are also shown (Sayre et al., 2014). Pink colors indicate warmer EMUs and blue colors indicate colder EMUs. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.

Figure 5. A 2D representation of bottom-occurring EMUs. On land, the terrestrial ecological land units (ELUs) are also shown (Sayre et al., 2014). Pink colors indicate warmer EMUs and blue colors indicate colder EMUs. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.

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panels in the following several pages. The horizontal geographic distribution of the EMU is shown in purple. Darker purple colors show where the EMU is relatively thicker in the vertical dimension, while lighter purple colors indicate where the EMU is relatively thinner. The number and name of each EMU is found in the lower left corner of each map panel. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.

Figure 7. Figure 7 – A 3D visualization of EMUs off the coast of California. On land, the ecological land units data (ELUs) from Sayre et al. (2014) are shown, with features like the Central Valley and Sierra Nevada Mountains in the upper center, and Southern California landscapes in the lower right. In the water, the EMUs are portrayed as bands on cylinders, where each EMU is a different colored band on the cylinder. Reddish/pink colors denote shallower, warmer EMUs, while blueish/black colors denote deeper, colder EMUs. Temperature gradients are evident from inshore to offshore regions, and from southern to northern coastal areas. Although the EMUs exist as continuous surfaces, representing them as cylinders and removing some of the volume between the mesh points enables the visualization of multiple, stacked EMUs at depth.

Figure 8. The interface of the EMU Explorer application, a webbased (http://livingatlas.arcgis.com/emu) guery tool for interacting with the EMU data. A point is selected on the surface of the ocean (red point in the middle of the Atlantic Ocean) and all the points with the same EMU as the selected point are shown. A vertical profile is shown on the right, where the user can select one of the six parameters used to cluster the EMUs (temperature, salinity, dissolved oxygen, nitrate, phosphate, and silicate) and see the attribute values down through the vertical profile at that x,y coordinate. The two lower panels contain descriptive statistics on the EMU physical and chemical parameters (lower left) and depth and thicknesses (lower right).

## List of Tables

Table 1. Depths, thicknesses, and compositional properties of EMUs.

# **A New Map of Global Ecological Marine Units An Environmental Stratification Approach**

By Roger Savre, Jack Dangermond, Dawn Wright, Sean Brever, Kevin Butler, Keith Van Graafeiland, Mark Costello, Peter Harris, Kathleen Goodin, Maria Kavanaugh, Noel Cressie, John Guinotte, Zeenatul Basher, Patrick Halpin, Mark Monaco, Peter Aniello, Charles Frye, Drew Stephens, Page Valentine, Jonathan Smith, Rebecca Smith, D. Paco VanSistine, Jill Cress, Harumi Warner, Clint Brown, John Steffenson, Douglas Cribbs, Beata Van Esch, Dabney Hopkins, Guy Noll, Steve Kopp, and Charles Convis.

In response to an intergovernmental commission for a high resolution and data-derived global marine ecosystems map, distinct marine physical and chemical volumetric regions were characterized in an environmental stratification of the global ocean. The stratification produced 37 ecological marine units (EMUs) at a base resolution of  $\frac{1}{4}$ ° (approximately 27 kilometers at the equator). The EMUs were objectively derived from non-supervised statistical clustering of over 52 million points from NOAA's World Ocean Atlas 2013 (WOA) database, an authoritative 57 year archive of global water column data. We organized the WOA data into a 3D ocean point mesh which represents a standardized geospatial framework for organizing physical, chemical, and biological data that characterize ocean composition and processes. The points are currently attributed with values for temperature, salinity, dissolved oxygen, nitrate, phosphate, and silicate, the six input values used in the stratification. The data represent the most accurate, current, globally comprehensive, and finest spatial resolution data available for each of the six inputs organized in a standardized geospatial framework for improved understanding of ocean environments. While the methodology and initial findings are reported elsewhere, we provide herein a more detailed description of the open data geospatial resources and and associated tool development. We present the EMU Explorer as a web-based query application that allows for the exploration of both the modeled EMUs as volumetric regions, and the comprehensive point data from the WOA.

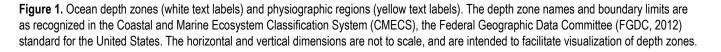
#### **Marine Ecosystems and Ocean Zones**

Longhurst's ocean biomes and provinces, and Bailey's As assemblages of biotic communities interacting with ecoregions of the oceans maps are both examples of global each other and with their physical environment (Tansley, ocean subdivision using physical factors. Reygondeau et 1935; Odum, 1971), ecosystems are understood as existing al. (2017) objectively subdivided the Mediterranean Sea in terrestrial, freshwater, and marine domains, and as having into 63 biogeochemical regions using environmental data. both biotic and abiotic components. Mapping assemblages In addition to the geographic distribution of ocean of biological communities, which are themselves assemregions, there is interest in the vertical variation of the ocean blages of species, can be a difficult undertaking given the environment, and the associated subdivision of the water enormous amount of species distribution data required. column into different depth zones. Vertical zonation in the Marine biogeographic regions have nevertheless been ocean is broadly accepted as a fundamental oceanographic quantitatively delineated from data using tens of thousands concept, and many textbooks include a diagram similar to of species distribution records (Costello et al., submitted) Figure 1, showing vertical zones in the water column. Ocean or derived from interpretive, largely expert opinion-based zones are often named and generally depth-bounded as in processes (UNESCO, 2009). Another approach to spatial Figure 1: epipelagic (0 to 200 m), mesopelagic (200 to 1000 delineation of marine ecosystems emphasizes the characterm), bathypelagic (1000 to 4000 m), abyssopelagic (4000 to ization of the abiotic environment as it structures the phys-6000 m) and hadalpelagic (>6000 m), although the depth ical forcing of biological processes (Longhurst, 2007), also boundaries can vary from one characterization to the next.

#### Abstract

#### Introduction

known as the controlling factors approach (Bailey, 1996).





The Coastal and Marine Ecosystem Classification System (CMECS) presents standardized definitions and criteria for describing marine ecosystem properties, and is recognized as the standard for the United States (FGDC, 2012). The CMECS depth zone boundaries are as above and in Figure 1.

While there have been many attempts to subdivide the ocean for a variety of applications, none have been globally comprehensive, three-dimensional, and based on objective statistical clustering of long-term, time-averaged data. Adopting the controlling factors approach, we mapped physically and chemically distinct volumetric regions of the ocean and called them ecological marine units (EMUs) given their role in establishing the ecological potential of the environment to which marine biota respond. The EMU development process was a first of its kind, 3D statistical clustering of global ocean environment data averaged over a 57 year period. The methodological details and intial findings are reported elsewhere (Sayre et al., submitted). Herein we describe the global EMU resource as a set of open data geospatial products.

#### The GEO (Group on Earth Observations) **Global Ecosystem Mapping Task**

The Group on Earth Observations (GEO) is a consortium of over 100 nations which seeks to leverage the use of Earth observations to help solve some of society's greatest challenges (GEO, 2005). To that purpose, GEO has

developed an intergovernmental protocol and associated workplan which includes an initiative (GI-14 GEO ECO, http://www.earthobservations.org/activity.php?id=116) on global ecosystems. The initiative formally commissions the development of a standardized, robust, and practical map of global ecosystems for terrestrial, freshwater, and marine environments (Savre et al., 2007). The United States is the member nation of GEO leading this activity, and the U.S. Geological Survey (USGS) is the designated federal agency implementing the work.

In response to that commission from GEO, the USGS and Esri established a public/private partnership and mapped terrestrial ecosystem distributions using a structure-based mapping approach where the ecosystems were delineated from a vertical integration of the climate regime, landforms, substrate, and land cover (Savre et al., 2014). That effort produced a set of global ecological land units, or ELUs (Figure 2), as physically distinct areas and their associated vegetation. Subsequent to that terrestrial ecosystem mapping effort, and again responding to the GEO intergovernmental charge to produce standardized, robust, and practical global ecosystem maps for marine environments, the USGS/Esri team then developed a similar method for stratifying the global ocean into physically and chemically distinct volumetric regions. For the marine ecosystem mapping effort, the team included a steering committee of international marine scientists.

Figure 2. Global ecological land units (ELUs) produced from a global ecophysiographic stratification by climate, landform, lithology, and land cover (Sayre et al., 2014), in response to a commission from the Group on Earth Observations (GEO) to produce a standardized, robust, and practical global ecosystems map for terrestrial environments.



### **Summary of Method and Results**

The fundamental approach undertaken herein was stratify the ocean into physically and chemically distin areas. The stratification was produced from unsupervise statistical clustering of data from NOAA's 2013 Wor Ocean Atlas version 2 (Locarnini et al., 2013; Zweng al., 2013; Garcia et al., 2013a; Garcia et al., 2013b). full description of the data and the statistical clustering approach is provided elsewhere (Sayre et al., submitted and we provide a brief summary herein. The data used the clustering represent 57 year average values for ten perature, salinity, dissolved oxygen, nitrate, phosphate, a silicate. There are approximately 52 million ocean da points representing the entire water column. The horizont resolution of the data is 1/4°, or approximately 27 km ne

EMU distributions at the ocean surface (Figure 3), at a depth The input to the clustering algorithm was the set of approximately 52 million points, each containing values of 1000 m (Figure 4), and at the seafloor (Figure 5). Each for the following attributes: x, y, z, temperature, salinity, of these maps has the same legend, which is a master legend dissolved oxygen, nitrate, phosphate, and silicate. The showing the color assignments for all 37 EMUs, however, output from the clustering was the same set of points with all EMUs are not present on each map because they occur an additional attribute for the EMU (cluster) it was grouped at different depths. Cartographically, the EMUs are syminto. As such, the EMU data resource is in essence a geodabolized with a color that reflects the average temperature of the EMU, with pinks and reds denoting relatively warmer tabase of over 52 million points in x, y, and z dimensions which allows for the query and analysis of two kinds of EMUs, and blues and blacks representing colder EMUs. To better understand the geographic distributions of the spatial entities, the points themselves, or the EMU clusters they belong to. Descriptive statistics were produced to EMUs, we present a series of maps showing the number, name, geographic distribution, and thickness of each EMU in Figure 6. These maps facilitate comparisons of EMU The EMUs can be assessed as a 2D surface at any depth size, EMU vertical distribution, and the representation of for the 102 depth levels. As examples, we show the maps of the EMUs in the different oceans and seas.

characterize the depth, thickness, and physico-chemical composition of each EMU (Table 1).

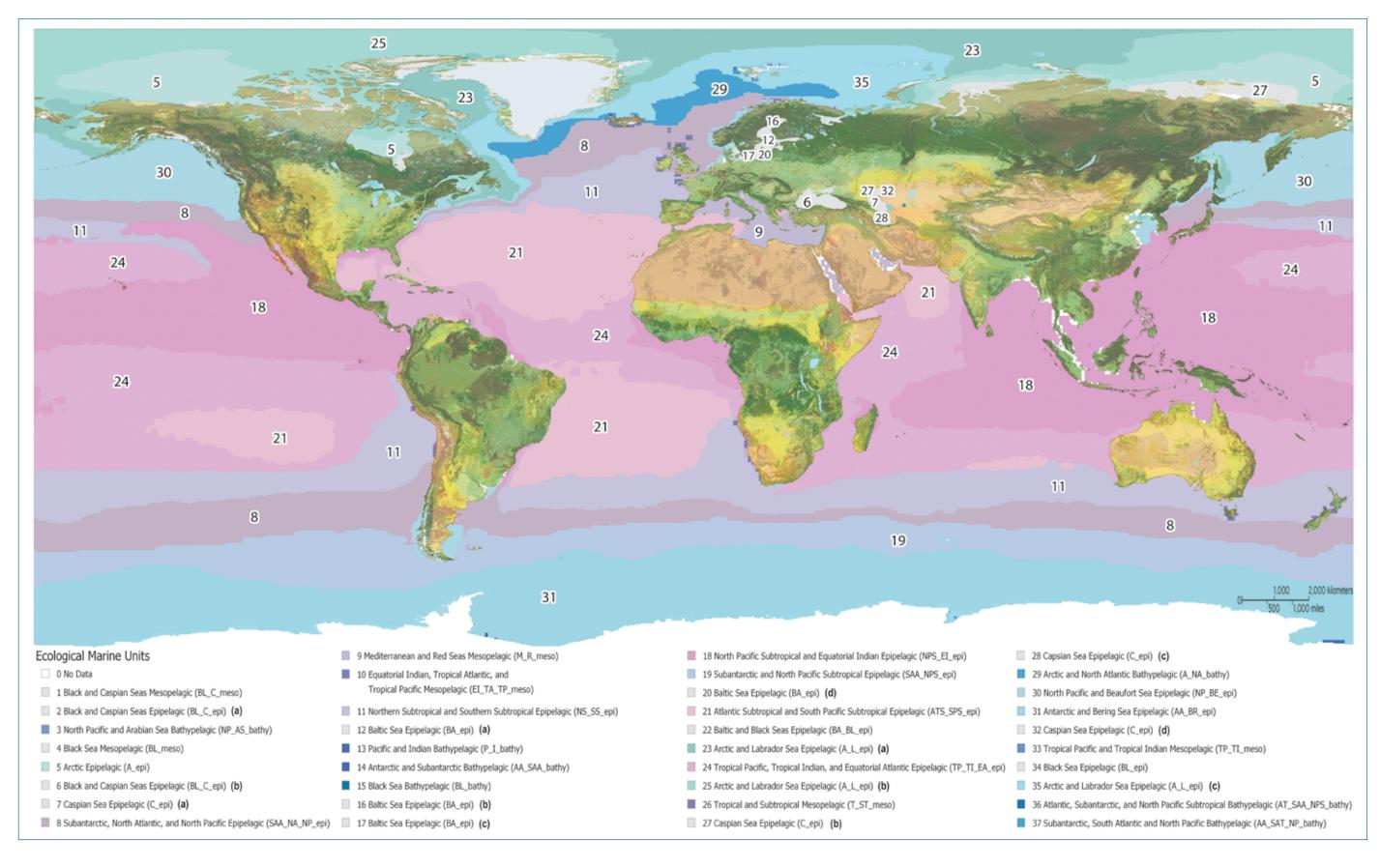
to	the equator. The depth intervals are variable from 5 m near
nct	the surface to 100 m in the deeper regions (>2000 m) for
ed	a total of 102 depth levels.
ld	The EMUs were produced from a k-means statistical
et	clustering of the point data, resulting in 37 distinct clus-
Α	ters. Each cluster, or EMU, is a physically and chemically
ng	distinct volumetric region. The clusters were neither con-
1),	strained geographically nor by depth, but strong regional
in	and depth zone separation was nevertheless observed,
n-	supporting the existence of regional compositional ge-
nd	ographies in the ocean in x, y, and z dimensions. This
ita	objectively-produced, three-dimensional, and globally
tal	comprehensive clustering of the ocean is a first-of-its-kind
ar	planetary stratification of the marine environment.

#### **EMU Data and Maps**

#### Table 1. Depths, thicknesses, and compositional properties of EMUs.

	Depth	n (m)	-	Temperatı	ıre (°C)			Salinity (	unitless)		Diss	olved Ox	ygen (µ	mol/l)		Nitrate (	(µmol/l)			Phosphate	e (µmol/	(1)		Silicate	(µmol/l)	
EMU	Unit Middle Median (m)	Thickness Mean (m)	Mean	Std Dev	Min	Max	Mean	Std Dev	Min	Max	Mean	Std Dev	Min	Max	Mean	Std Dev	Min	Max	Mean	Std Dev	Min	Max	Mean	Std Dev	Min	Max
1	220.87	148.13	8.30	1.62	-0.65	14.72	21.42	0.34	20.19	22.32	0.20	0.15	0.00	0.83	0.83	0.74	0.00	4.38	4.27	0.56	2.47	5.22	109.61	25.15	58.88	196.55
2	85.28	52.21	7.27	2.04	-0.44	9.56	19.82	0.71	18.43	21.61	2.68	1.13	0.52	4.67	2.85	1.04	0.00	4.22	0.82	0.35	0.18	2.50	33.65	13.16	4.28	64.21
3	1598.10	1253.52	2.60	0.62	0.47	5.16	34.54	0.12	33.52	35.03	1.47	0.62	0.21	2.98	42.34	1.82	26.67	56.12	3.03	0.15	2.27	4.10	149.53	19.52	106.22	247.19
4	498.16	445.63	8.89	0.15	4.62	14.93	22.03	0.16	21.72	22.40	0.10	0.11	0.00	0.70	0.11	0.26	0.00	1.45	6.18	0.54	5.13	7.27	160.29	30.75	111.00	231.35
5	12.32	18.47	-0.96	1.05	-1.62	12.10	28.59	0.78	25.99	29.63	8.71	0.48	5.03	9.89	1.16	1.08	0.00	15.24	0.79	0.24	0.00	2.24	9.36	5.37	0.31	32.87
6	30.45	26.94	9.24	4.06	-0.38	19.38	18.35	0.45	16.22	20.65	6.65	1.05	4.13	9.57	1.13	0.79	0.05	5.80	0.28	0.15	0.10	1.11	13.86	6.79	4.04	56.85
7	13.85	18.74	15.62	3.05	4.81	20.91	9.40	0.86	7.81	10.96	6.80	0.44	5.05	7.93	0.25	0.45	0.02	2.78	0.17	0.11	0.05	0.70	6.64	5.22	3.38	29.29
8	151.24	219.21	11.05	1.96	3.39	18.44	34.59	0.45	32.57	35.65	5.73	0.61	3.75	7.29	10.62	4.14	0.01	22.70	0.84	0.23	0.11	1.83	5.96	4.18	0.41	34.17
9	301.77	1481.43	15.28	2.86	12.52	29.53	38.62	0.41	37.34	40.77	4.69	0.53	2.04	5.98	3.75	2.84	0.00	15.02	0.19	0.11	0.02	0.77	4.76	2.78	0.31	26.46
10	390.89	339.64	9.83	2.26	4.66	24.20	34.78	0.30	33.63	36.94	1.56	0.87	0.03	3.55	30.84	4.20	9.87	43.71	2.28	0.31	1.26	3.36	31.96	12.38	6.75	96.02
11	101.22	172.49	16.46	2.26	10.07	21.67	35.33	0.41	33.93	36.46	5.23	0.46	3.25	6.46	3.66	3.27	0.01	19.98	0.39	0.19	0.05	1.40	3.33	1.86	0.27	20.34
12	88.50	33.47	4.73	1.36	0.72	14.05	10.22	0.64	8.98	12.03	1.62	0.64	0.29	4.36	5.85	0.82	3.15	7.72	2.39	0.39	1.20	3.85	43.60	4.95	28.70	60.68
13	2871.85	2010.79	1.93	0.51	-0.38	5.54	34.67	0.05	33.43	34.93	3.26	0.43	1.69	4.33	37.03	1.57	25.26	48.49	2.60	0.12	0.53	3.36	138.03	19.05	88.01	189.63
14	2595.55	2096.30	0.88	0.69	-2.05	3.31	34.70	0.04	33.27	34.90	4.74	0.41	2.96	6.86	32.71	1.21	16.96	40.33	2.27	0.09	1.49	3.02	115.20	13.89	72.25	167.23
15	1297.92	962.14	9.00	0.17	7.18	15.16	22.29	0.06	21.98	23.44	0.00	0.01	0.00	0.07	0.03	0.20	0.00	1.45	8.02	0.55	6.84	9.76	192.79	25.59	91.49	258.23
16	25.20	49.24	4.22	1.73	1.76	11.99	5.61	0.45	5.01	6.49	8.41	0.49	6.43	8.95	3.35	1.85	0.07	7.51	0.18	0.12	0.05	0.67	18.46	6.17	9.06	29.67
17	25.50	40.59	5.84	2.06	1.34	14.24	7.32	0.42	6.33	8.91	7.94	0.37	6.11	8.51	1.97	0.72	0.12	5.68	0.42	0.14	0.14	1.01	12.13	2.61	2.01	29.90
18	39.45	75.65	26.15	2.64	16.42	30.33	34.43	0.43	31.89	35.01	4.53	0.41	1.50	5.83	1.39	2.17	0.00	21.45	0.27	0.18	0.03	1.37	3.73	2.52	0.38	28.85
19	114.29	257.08	5.50	1.85	-1.52	13.74	34.09	0.20	33.11	34.70	6.64	0.51	4.21	7.74	20.64	3.51	9.30	32.16	1.49	0.20	0.49	2.20	10.46	6.04	0.00	54.73
20	65.63	12.41	4.04	1.23	1.11	8.88	8.79	0.54	7.47	11.00	4.78	1.06	2.69	7.20	4.54	0.89	2.33	6.03	1.30	0.37	0.54	2.11	26.88	5.50	14.59	40.52
21	63.96	182.66	22.53	3.00	12.67	29.73	36.48	0.36	35.77	38.13	4.80	0.40	2.43	5.88	1.56	2.34	0.01	16.50	0.20	0.15	0.01	1.40	1.72	1.14	0.39	18.82
22	7.67	10.43	8.15	4.89	0.07	15.55	15.87	0.84	13.37	17.01	2.98	0.55	2.32	3.79	6.62	0.35	6.13	6.97	1.60	0.21	1.30	1.86	37.82	4.62	31.11	43.72
23	40.18	33.21	-1.13	1.31	-1.88	14.03	32.22	0.45	30.92	33.24	8.02	0.51	4.50	10.38	4.65	2.63	0.00	17.03	0.96	0.31	0.05	2.49	11.44	6.19	0.61	45.16
24	50.00	94.99	24.77	2.52	18.78	29.54	35.39	0.30	34.73	36.26	4.58	0.43	1.76	5.51	2.05	2.67	0.00	15.01	0.31	0.23	0.01	1.40	2.95	1.94	0.25	17.58
25	25.28	29.37	-1.27	1.11	-1.76	13.84	30.70	0.48	29.54	31.64	8.65	0.43	5.08	10.39	1.91	1.35	0.03	16.50	0.88	0.23	0.01	2.21	9.56	3.75	0.61	37.57
26	242.26	159.79	14.27	3.62	6.80	26.44	35.14	0.46	33.59	36.91	3.21	0.75	0.47	4.99	17.48	4.37	1.80	32.24	1.27	0.28	0.47	2.43	12.37	6.41	1.61	60.31
27	26.81	15.74	2.95	4.03	-1.26	19.23	22.60	1.29	20.42	25.32	7.59	1.38	4.63	9.59	0.92	1.19	0.00	6.53	0.46	0.32	0.06	1.52	15.62	9.33	1.62	49.03
28	19.60	33.56	12.67	3.43	0.19	19.84	12.76	0.36	10.96	14.27	6.72	0.60	3.79	9.34	0.19	0.69	0.00	6.13	0.20	0.10	0.06	1.30	6.49	7.02	2.10	56.85
29	1127.70	2168.50	0.69	1.72	-2.00	7.40	34.89	0.12	33.93	35.38	6.71	0.30	4.83	8.31	13.83	2.17	1.69	22.58	0.96	0.13	0.10	1.60	9.87	3.28	0.29	41.33
30	66.47	75.72	3.88	4.28	-1.79	18.56	32.82	0.33	30.95	33.78	6.76	0.50	4.20	8.31	13.11	5.02	0.00	29.71	1.40	0.36	0.25	2.70	25.00	10.61	0.61	78.33
31	65.30	170.49	-0.27	1.39	-2.05	5.81	34.05	0.27	32.12	34.92	7.30	0.52	4.98	8.98	27.53	2.21	12.71	39.64	1.94	0.15	0.99	3.08	50.42	18.01	8.21	103.82
32	15.56	27.92	21.59	2.45	12.46	26.49	6.66	0.58	5.18	7.90	6.79	0.56	4.94	7.62	0.15	0.09	0.02	0.45	0.11	0.05	0.05	0.30	4.67	1.37	2.13	13.41
33	935.40	603.19	4.99	1.33	0.74	10.44	34.53	0.26	33.39	35.69	1.65	0.71	0.04	3.38	39.25	2.77	19.00	49.67	2.87	0.20	1.84	3.88	87.61	18.54	25.97	127.58
34	157.95	52.39	4.79	4.24	-1.10	14.49	23.58	1.20	22.32	25.56	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	10.29	0.40	9.76	11.62	194.10	14.06	158.85	218.22
35	60.08	80.45	-0.90	1.40	-2.04	10.37	33.89	0.43	32.88	34.88	7.44	0.53	5.08	9.17	6.88	2.45	0.22	24.60	0.74	0.23	0.09	1.49	8.03	4.71	0.44	74.12
36	1580.53	957.82	4.58	2.12	-0.99	12.05	34.76	0.30	33.23	35.86	5.27	0.53	3.21	6.36	22.74	3.00	12.16	35.69	1.53	0.22	0.73	2.23	27.13	13.82	0.00	80.48
37	1139.29	779.85	3.13	1.23	-1.97	10.51	34.52	0.20	32.67	35.12	4.25	0.52	2.39	6.02	32.70	2.29	10.54	41.95	2.26	0.17	1.45	3.07	62.60	18.90	12.00	101.91

Figure 3. A 2D representation of surface-occurring EMUs. On land, the terrestrial ecological land units (ELUs) are also shown (Sayre et al., 2014). Pink colors indicate warmer EMUs and blue colors indicate colder EMUs. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.





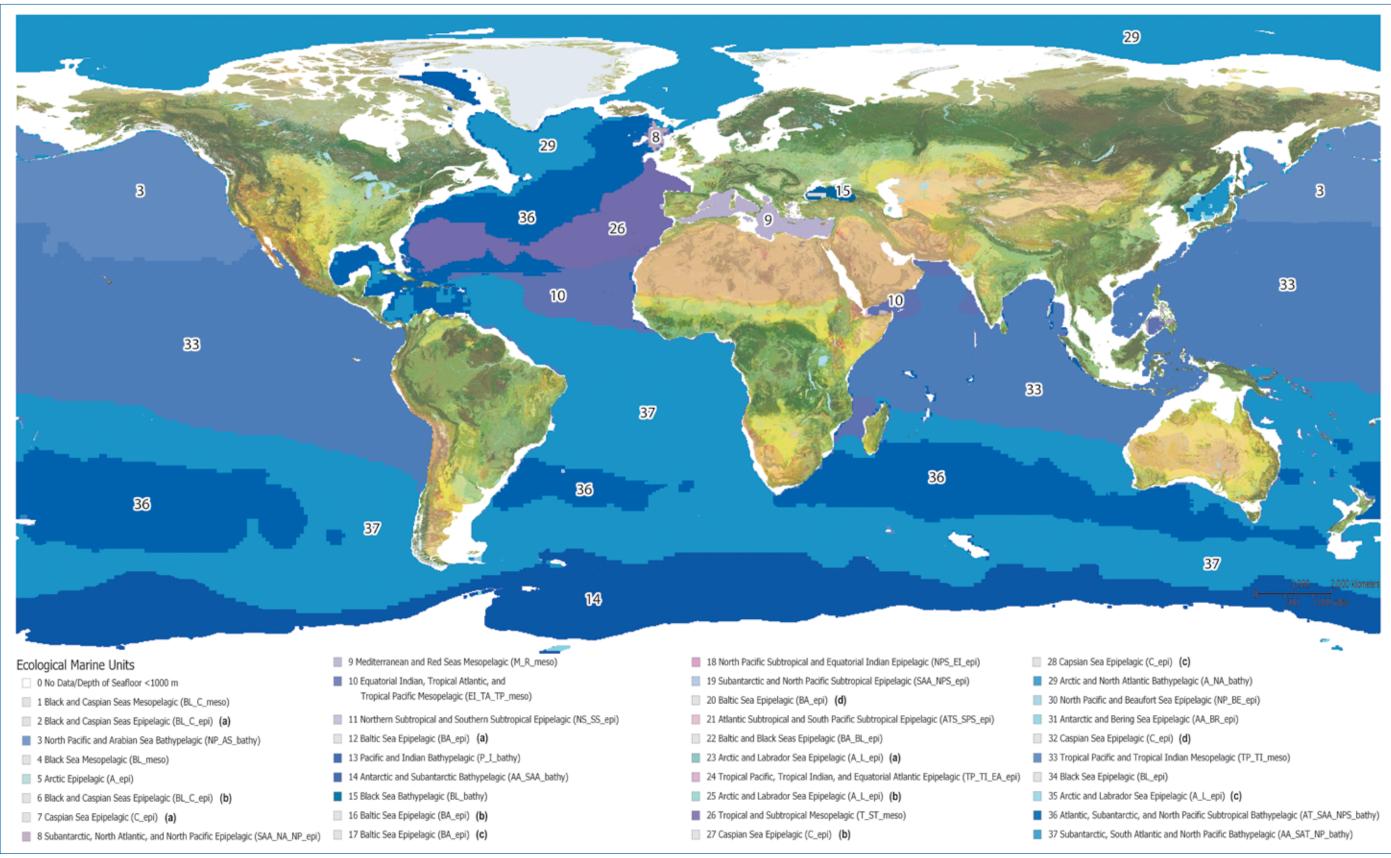
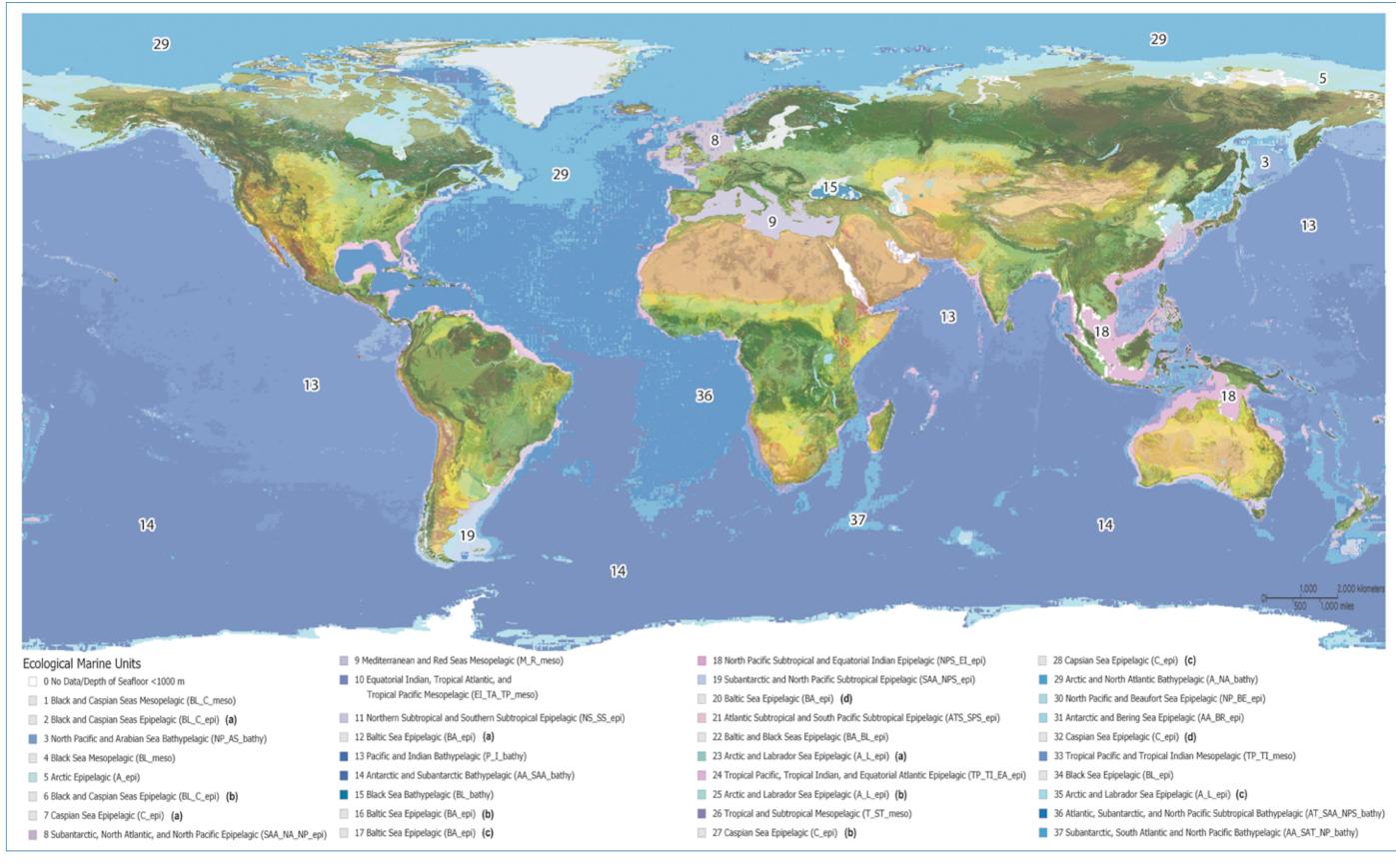


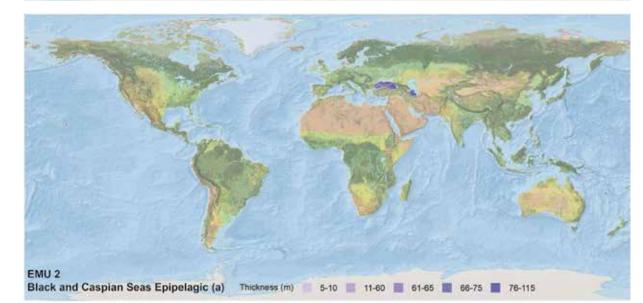
Figure 5. A 2D representation of bottom-occurring EMUs. On land, the terrestrial ecological land units (ELUs) are also shown (Sayre et al., 2014). Pink colors indicate warmer EMUs and blue colors indicate colder EMUs. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.

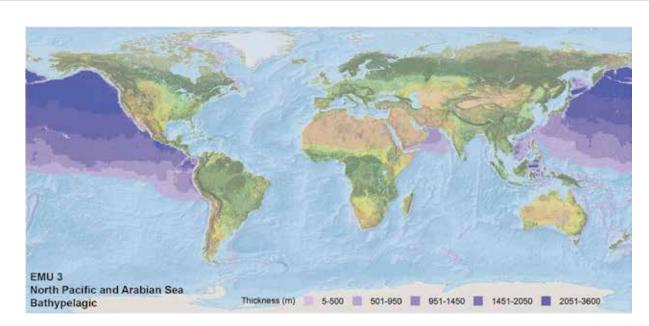


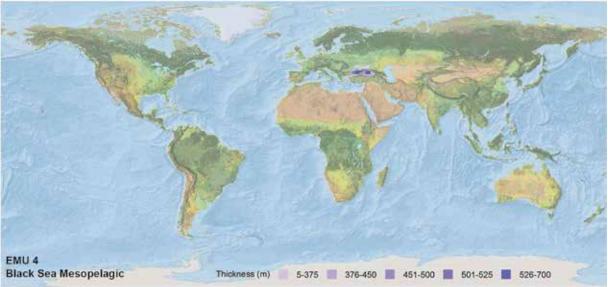
**Figure 6.** A series of maps showing the numbers, names, geographic distributions, and thicknesses of each EMU. Each panel shows the distribution of a single EMU, for a total of 37 panels in the following several pages. The horizontal geographic distribution of the EMU is shown in purple. Darker purple colors show where the EMU is relatively thicker in the vertical dimension, while lighter purple colors indicate where the EMU is relatively thinner. The number and name of each EMU is found in the lower left corner of each map panel. While each EMU is compositionally distinct, generally similar EMUs in proximity can share the same name.

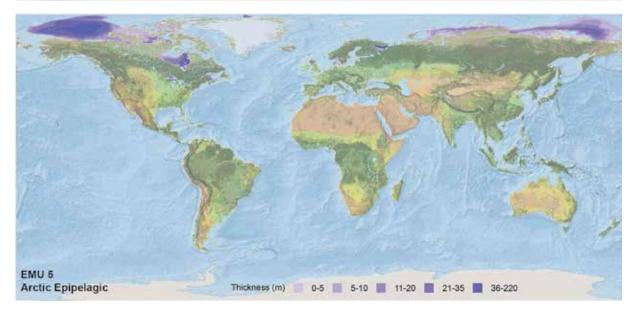


Black and Caspian Seas Mesopelagic Thickness (m) 0-5 📰 6-175 📰 176-200 📰 201-225 🔳 226-300



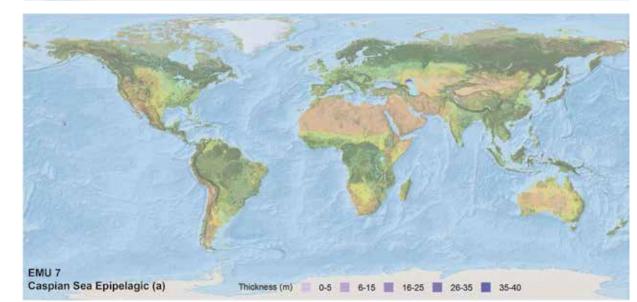


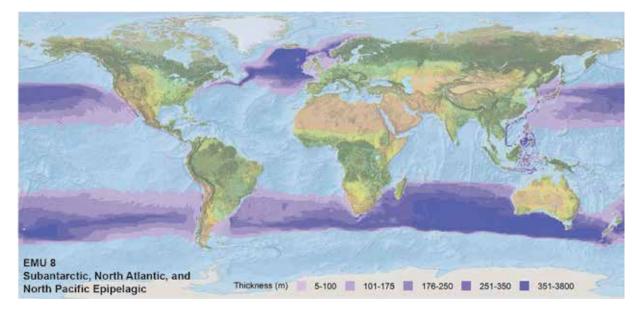




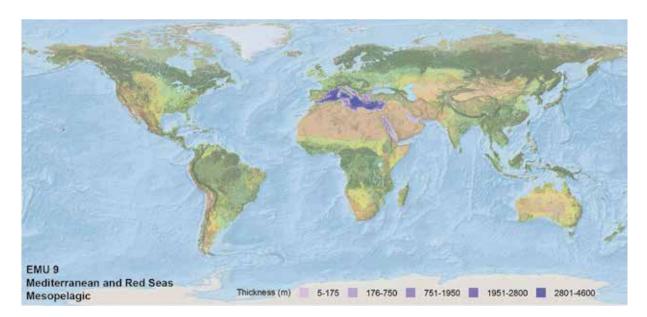


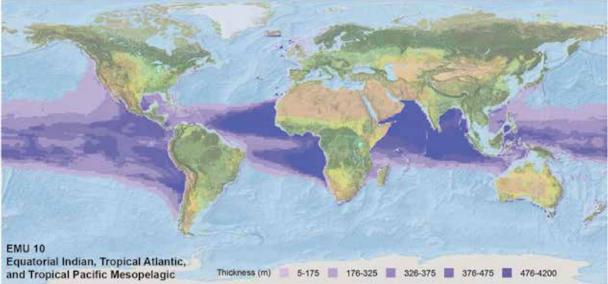
Black and Caspian Seas Epipelagic (b) Thickness (m) 0-5 📰 6-10 📰 11-60 📰 61-70 📰 71-125

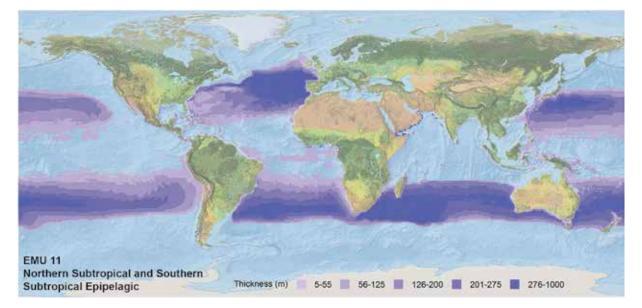


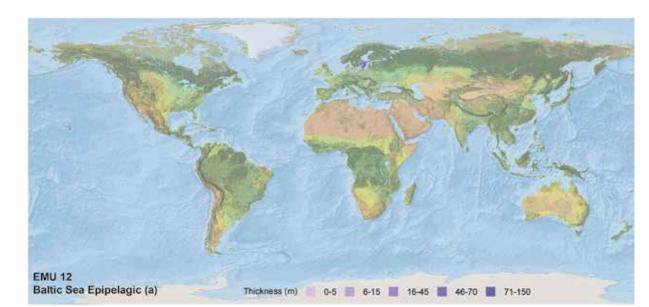


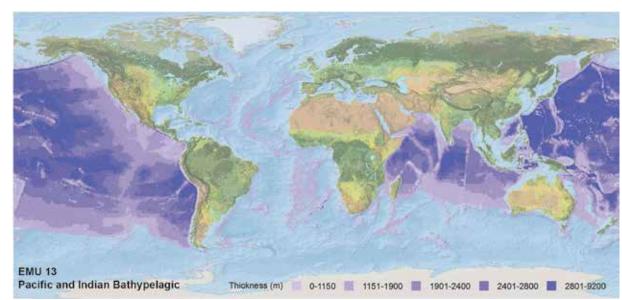
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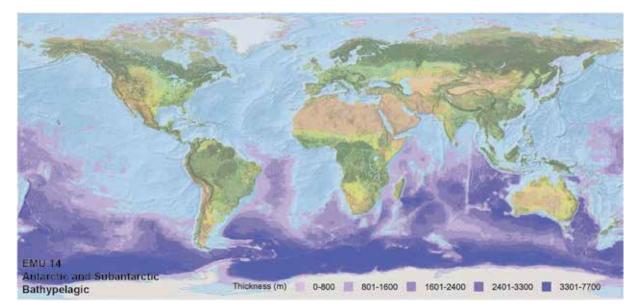


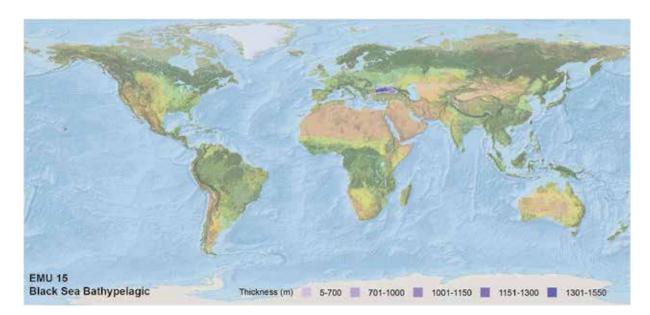


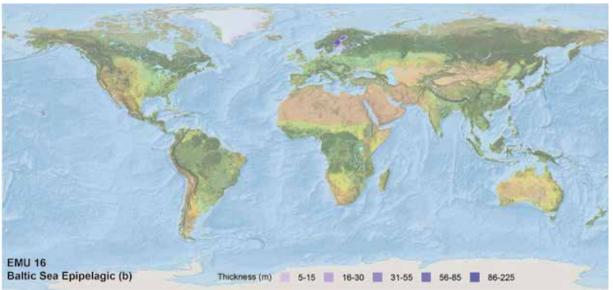


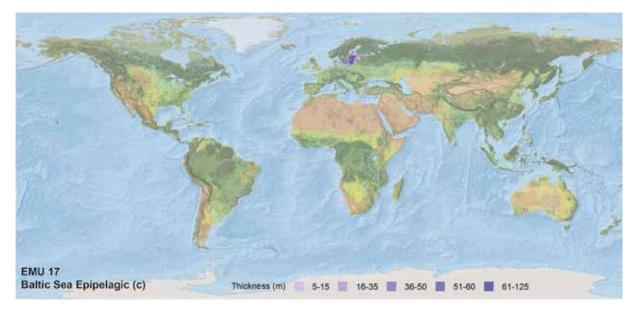










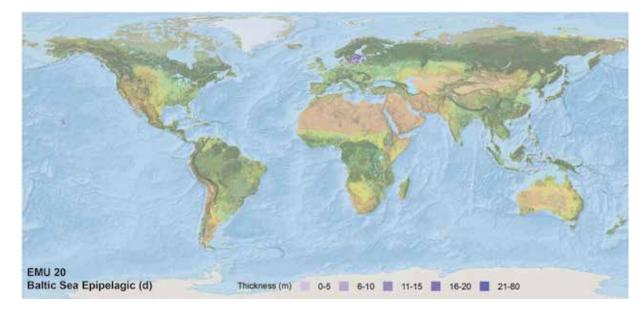


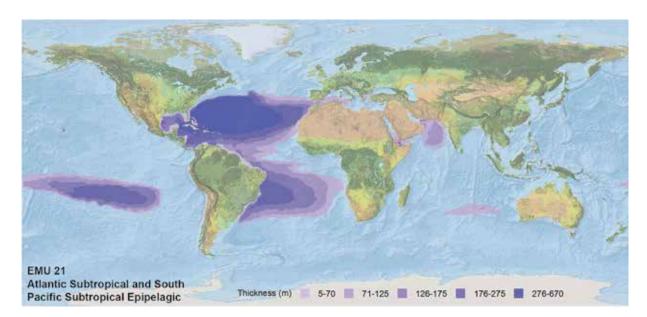


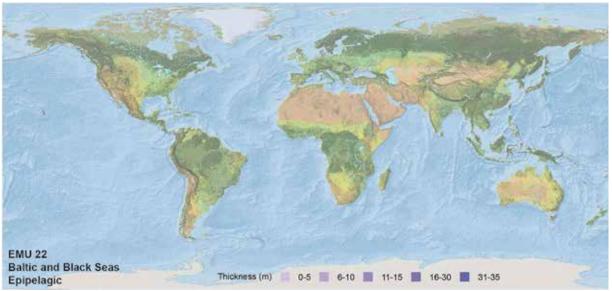
North Pacific Subtropical and Equatorial Indian Epipelagic Thickness (m) 5-40 41-65 66-90 91-120 121-175

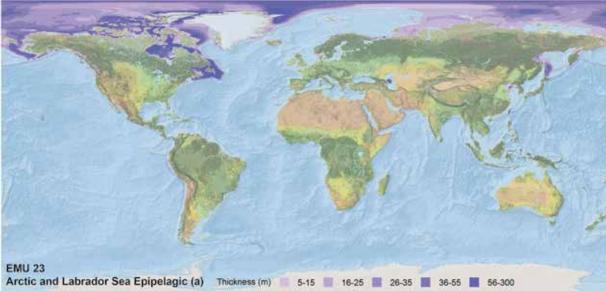


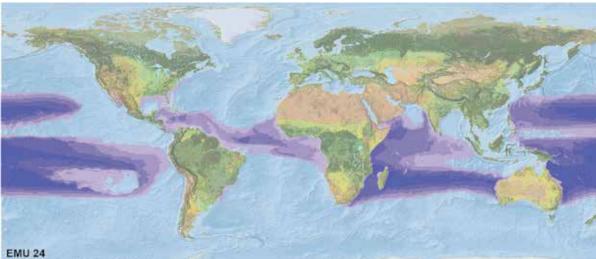
Subantarctic and North Pacific Subtropical Epipelagic Thickness (m) 0-50 51-150 151-325 326-475 476-1050



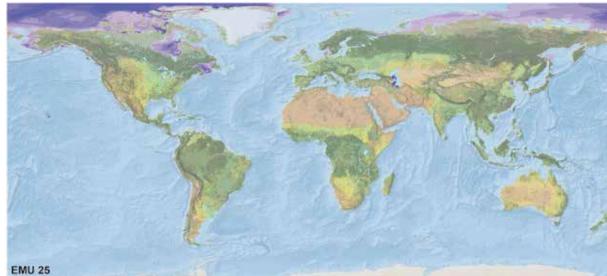




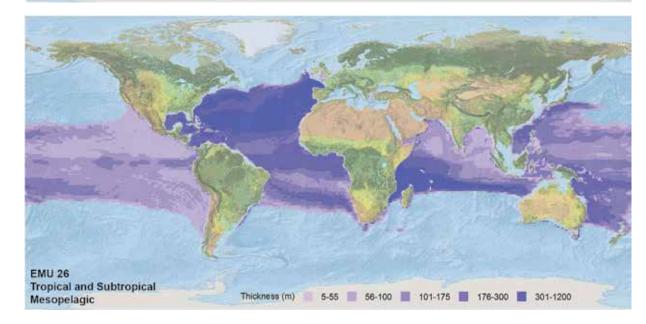




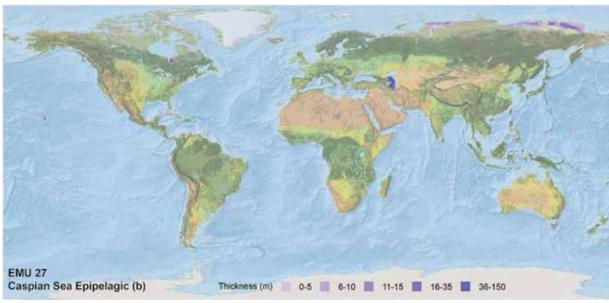
Tropical Pacific, Tropical Indian, and Equatorial Atlantic Epipelagic Thickness (m) 5-35 38-65 66-100 101-150 151-275



Arctic and Labrador Sea Epipelagic (b) Thickness (m) 5-10 11-25 26-35 36-50 51-650

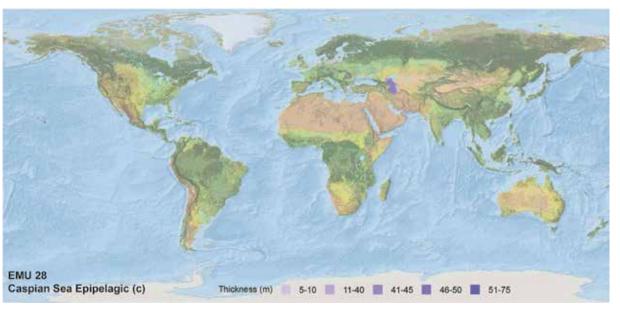


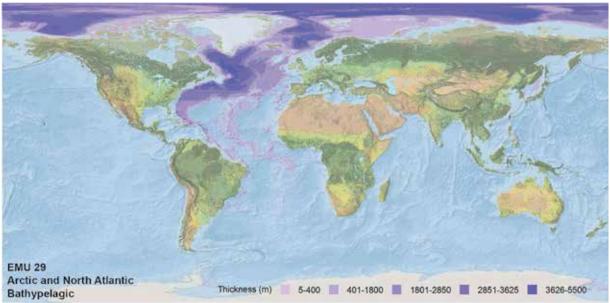
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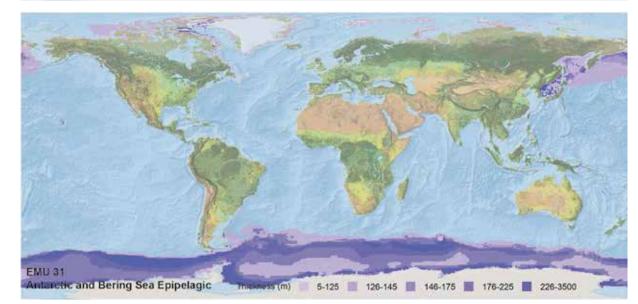


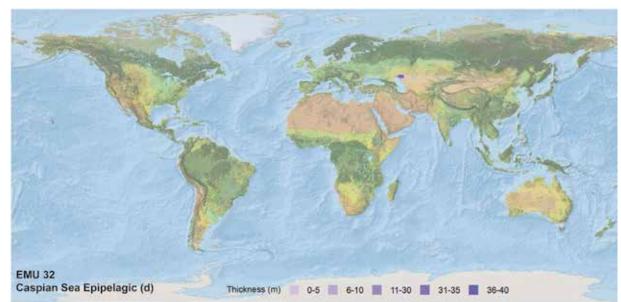


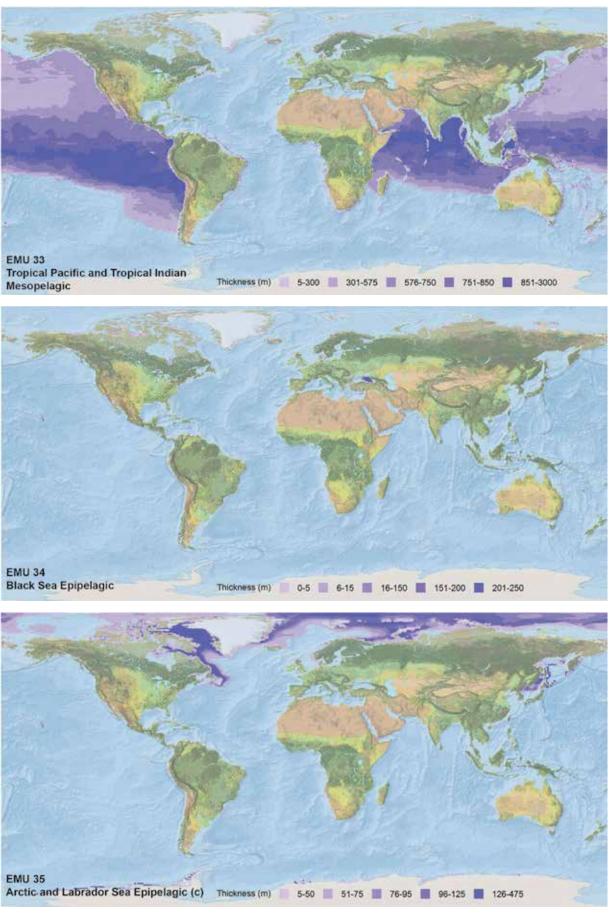


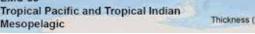


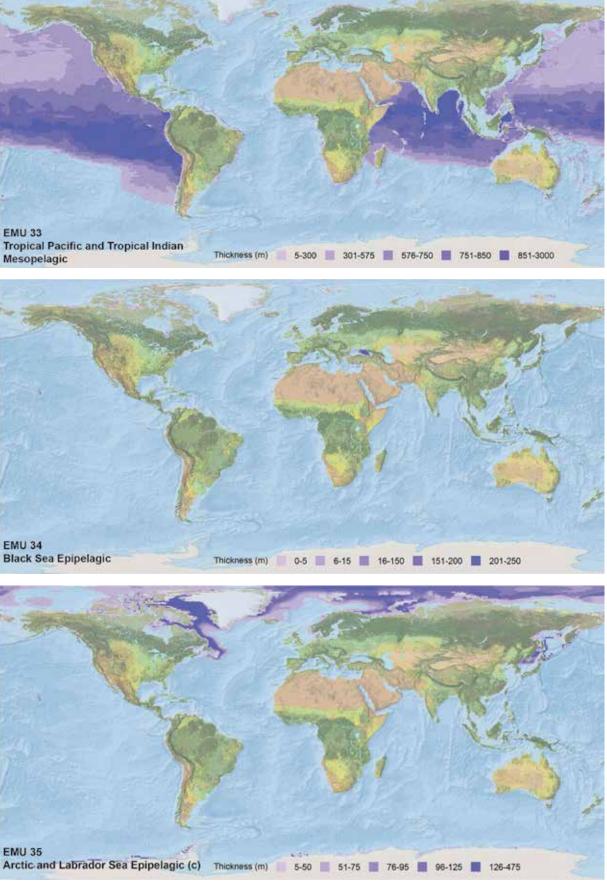
Thickness (m) 5-30 31-65 66-85 86-125 126-250 Epipelagic

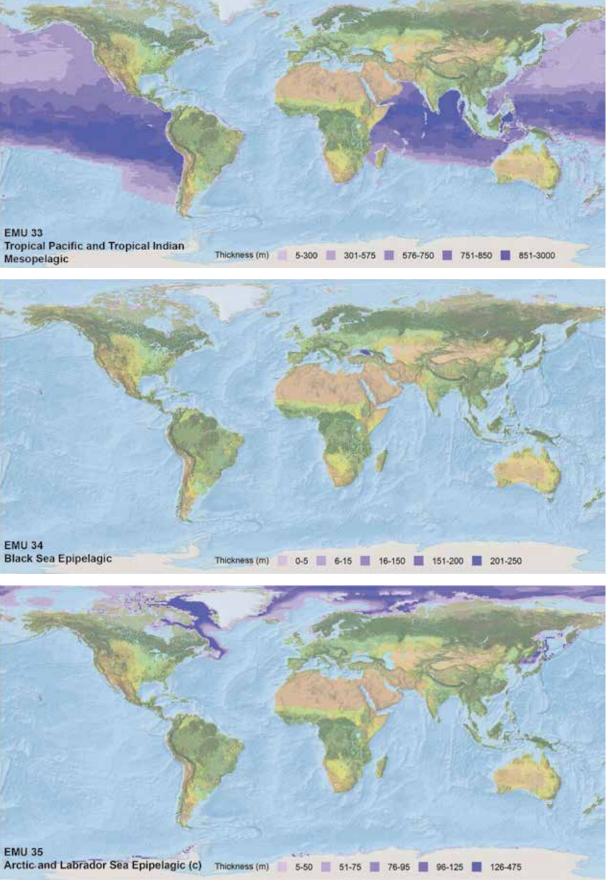


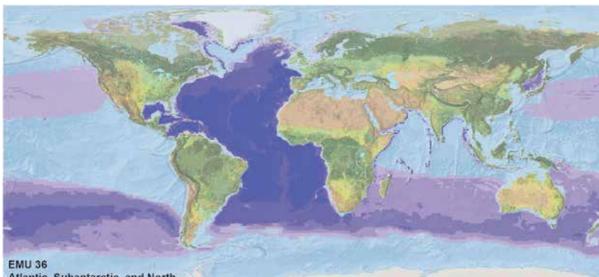




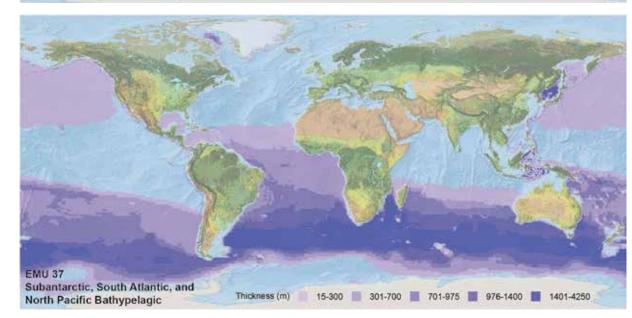






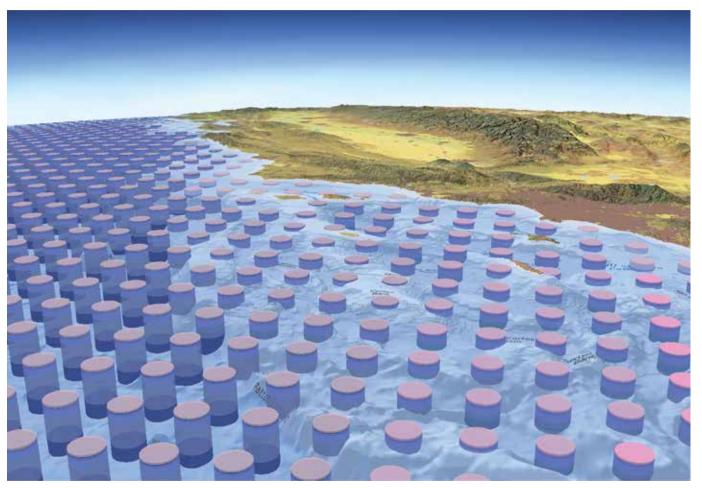


Atlantic, Subantarctic, and North Pacific Subtropical Bathypelagic Thickness (m) 5-125 126-300 301-525 526-2350 2351-7400



### **Three-dimensional Visualization of EMUs**

The EMU data are a de facto example of a "big data," three-dimensional database, and as such present a visualization challenge. While it is quite straightforward to select, analyze, and visualize any two-dimensional horizontal "slice" of the global EMUs, as in **Figures 3**, **4**, and **5**, it is more difficult to visualize them simultaneously in x, y, and z dimensions. Spatial analytical software capable of 3D visualization is required. We used ArcGIS Pro version 1.3 to successfully render the data in a 3D visualization environment (**Figure 7**). The EMU data, while in reality a continuous surface, are visualized as cylinders where the vertical centerline of the cylinder is defined from the vertically aligned points in the ocean point mesh. Different colored bands on each cylinder represent the different EMUs that are encountered with increasing depth. Representing the data as a cylinder instead of a continuous surface has the effect of cutting away volume between the gridded points, enabling the viewer to "see between" the points and observe the stacked EMUs from the sea surface to the seafloor in many cases. In addition to the visualization functionality, the EMU data are queryable as well from user interaction with the colored bands. **Figure 7.** A 3D visualization of EMUs off the coast of California. On land, the ecological land units data (ELUs) from Sayre et al. (2014) are shown, with features like the Central Valley and Sierra Nevada Mountains in the upper center, and Southern California landscapes in the lower right. In the water, the EMUs are portrayed as bands on cylinders, where each EMU is a different colored band on the cylinder. Reddish/ pink colors denote shallower, warmer EMUs, while blueish/black colors denote deeper, colder EMUs. Temperature gradients are evident from inshore to offshore regions, and from southern to northern coastal areas. Although the EMUs exist as continuous surfaces, representing them as cylinders and removing some of the volume between the mesh points enables the visualization of multiple, stacked EMUs at depth.

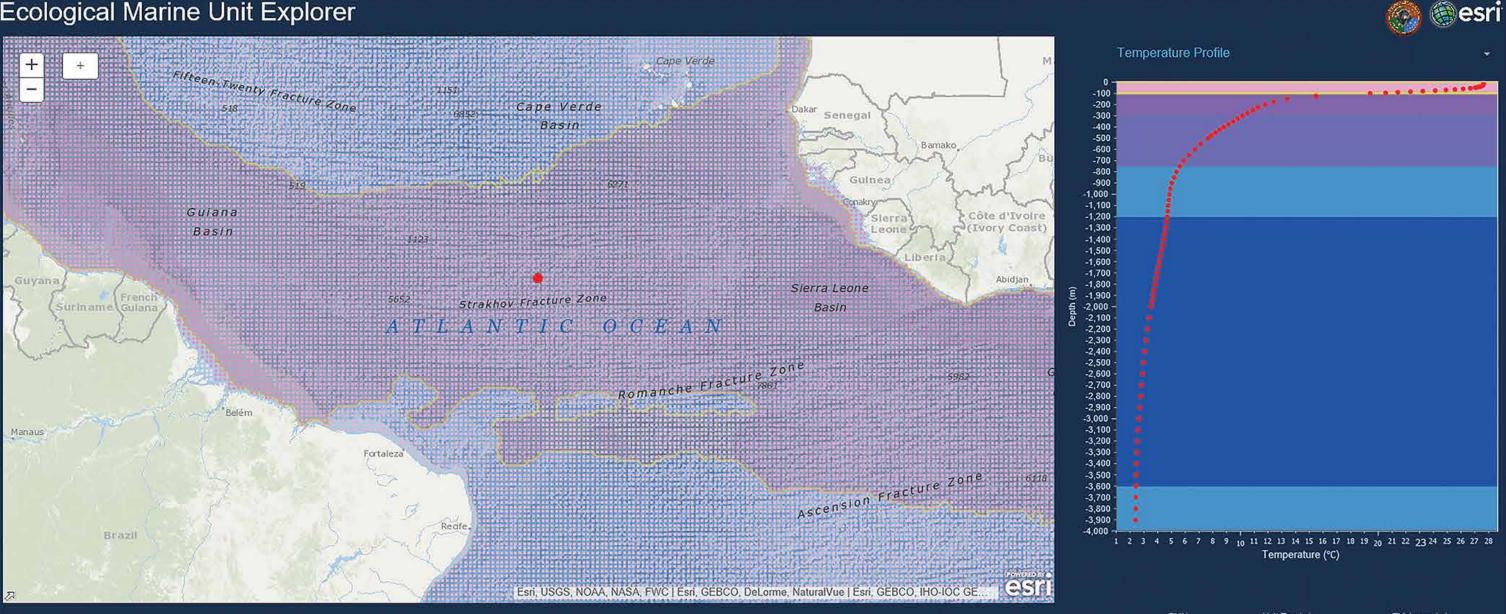


### The EMU Explorer Application

While the data are visualizable and queryable with the The interface has four panels, a pan and zoom-capable advanced functionality provided by sophisticated GIS map of the global ocean in the upper left panel, and three software, it was also desirable to develop an open data, information panels in the upper right, lower right, and lower left of the screen. The upper right panel shows the entire web-based application which would allow access to the resource with the only criteria being Internet connectivity. vertical profile of the attribute values for any one of the six We therefore developed the EMU Explorer application, parameters (temperature, salinity, dissolved oxygen, nitrate, accessible at http://livingatlas.arcgis.com/emu. This tool phosphate, and silicate), the choice of which is user-seallows the user to select a point anywhere on the surface of lected. The lower left panel underneath the map presents the ocean, and obtain information about the selected point descriptive statistics for all of the parameters of the selected (x,y) on the sea surface and at all of the points at that same EMU. The lower right panel shows the depth and thicklatitude and longitude with differing depth (z) values (the ness dimensions of all the EMUs occurring in the vertical vertical profile). In addition to the information on the points, profile. All the panels are cross-linked such that a change of query to another point or EMU in any panel changes information is also provided on the EMU that the point belongs to. Figure 8 shows the EMU Explorer Interface. the information presented in the other panels accordingly.

Figure 8. The interface of the EMU Explorer application, a web-based (http://livingatlas.arcgis.com/emu) query tool for interacting with the EMU data. A point is selected on the surface of the ocean (red point in the middle of the Atlantic Ocean) and all the points with the same EMU as the selected point are shown. A vertical profile is shown on the right, where the user can select one of the six parameters used to cluster the EMUs (temperature, salinity, dissolved oxygen, nitrate, phosphate, and silicate) and see the attribute values down through the vertical profile at that x,y coordinate. The two lower panels contain descriptive statistics on the EMU physical and chemical parameters (lower left) and depth and thicknesses (lower right).

# **Ecological Marine Unit Explorer**





Euhaline-Oxic-Warm to Very Warm-Epipelagic with (Low Nitrate-Low Silicate-Low Phosphate) Nutrients

	Temperature	Salinity	Dissolved O <sub>2</sub>	Nitrate	Phosphate	Silicate	Thickness	Unit Top
	V/90/03/03/02/	500000.S	Sector Contraction	ALMER CONTR.	2002/2002/2002	176 Ac 412	NUDWSERS.	2 (AL 2000)
Minimum	18.78	34.73	1.76	0.00	0.01	0.25	5.00	-250.00
Maximum	29.54	36.26	5.51	15.01	1.40	17.58	25.00	0.00
Average	24.77	35.39	4.58	2.05	0.31	2.95	7.40	-56.42
SD	2.52	0.30	0.43	2.67	0.23	1.94	6.50	43.14

EMU	Unit Top (m)	Thickness (m)
24	0	100
26	-100	200
10	-300	450
37	-750	450
35	-1200	2800
29	-3600	400

## Accessing and Using the Data

The EMU web page is accessible at http://esri.com/ecological-marine-units. The EMU data products and the EMU Explorer are open data resources available without a login requirement from the Esri Living Atlas (http://livingatlas. arcgis.com) and elsewhere in the ArcGIS Online content pool (http://esriurl.com/emudata). The EMU data are therefore easily integrated with hundreds of other datasets representing the most current, detailed, authoritative, and curated GIS-ready global data available. This integration is easily accomplished without the need for downloading, preparing, and reconciling disparate datasets by the user. The entire EMU geodatabase (~38 GB) is addressable and can be accessed using either ArcMap or ArcGIS Pro technologies. A number of datasets, information products (pdfs), storymaps, browse and query applications, and other resources are now freely available to users, and the number of curator-supplied (Esri) and associated user-supplied resources is rapidly growing. An ArcGIS Online search on "ecological marine units EMUs)" will return descriptions of and links to these expanding resources.

The global data are accessible either through map packages (ArcMap) or project packages (ArcGIS Pro). In the ArcMap resource, three 2D slices of the global data, corresponding to the maps shown in Figures 3 (top), 4

In a first-of-its kind effort to objectively partition the global ocean into volumetric regions using 3D data on ocean physical and chemical properties, 37 ecological marine units (EMUs) were mapped. The standardized EMU ocean regions data could be used in assessments of marine biodiversity, marine ecological processes, and marine ecosystem accounting, and could inform resource management and planning. Maps and data describing each

We acknowledge and thank the American Association of Geographers for their support not only in producing this work, but previous ecosystem mapping efforts as well. In particular, Doug Richardson has shared the global ecosystem mapping vision from the beginning, and has supported publications on South American Terrestrial Ecosystems, African Terrestrial Ecosystems, and the Global Ecological Land Units. Rebecca Pendergast has provided high quality advice on graphics and layout, and has produced three beautiful publications in this ecosystem mapping series. These documents, while technically detailed and scientific,

(1000 m), and 5 (bottom), are also provided as pre-prepared individual layers. In addition to the global EMU resource, the data have been sub-regionalized into Arctic Ocean, Atlantic Ocean, Pacific Ocean, Indian Ocean, Southern Ocean and Oceania subsets. Esri provides the source data as a cloud-based image (raster) service on its geospatial portal, ArcGIS.com, and the provided data are available as layers in ArcGIS Online and in ArcGIS for Desktop. The data are stored in the WGS 1984 geographic coordinate system to minimize the amount of data loss that will ocurr when projecting to other coordinate systems.

In addition to the EMU open data provision from Esri, the EMU geodatabase in .gdb format (~38 GB) with associated map packages (for use in ArcMap) and project packages (for use in ArcGIS Pro) is also available for download from the USGS Global Ecosystems Mapping webpages (https://rmgsc.cr.usgs.gov/ecosystems/ (main page) and https://rmgsc.cr.usgs.gov/ecosystems/datadownload.shtml (download site). This collection of resources includes information, data, and a viewer for the analog ELU (ecological land units) terrestrial product as well. Point features data are also available as an Open Geospatial Consortium (OGC) Geo Package or similar.

#### Conclusion

EMU are presented herein. Access to the data is open, and a visualization approach for working with the data in 3D is presented. The EMU Explorer, a sophisticated web-based query and analysis application, is described. The EMUs represent a standardized geospatial framework for storing existing ocean physico-chemical data, and for adding new ocean information as it becomes available.

#### Acknowledgments

also feature stunning graphics and layout which facilitate a broader understanding of the material. Cindy Cunningham, formerly of USGS, provided IT support of the best kind throughout the life of the effort. Andrea Grosse, Alberto Yanosky, Pat Comer, Mark Metzger, Trevor Platt, and Shubha Sathyendranath provided excellent ideas about this work years before it commenced in earnest. Barbara Ryan's exemplary leadership of the Group on Earth Observations, and the Geography Discipline at the U.S. Geological Survey before that, has always included enthusiastic support for global ecosystem mapping.

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The U.S. Geological Survey (USGS), Esri, the Group on Earth Observations (GEO), and the American Association of Geographers (AAG) are pleased to present A New Map of Global Ecological Marine Units – An Environmental Stratification Approach. This publication presents maps, data, and a web-based explorer application from a first-of-its-kind effort to partition the ocean into physically and chemically distinct volumetric regions called ecological marine units (EMUs). The EMUs were mapped from sea surface to seafloor in a true three-dimensional characterization of the oceanic water column.

The EMUs were developed in a public/private partnership between USGS and Esri, in a collaboration that included a steering committee of international marine scientists. The work to delineate the EMUs follows the development of an analogous global ecological land units (ELUs) product also developed by the USGS/Esri team, using a similar stratification-based mapping approach. Like the ELUs, the EMUs were commissioned by GEO as part of a global ecosystem mapping initiative. With this Special Publication, AAG recognizes the work as a contribution to understanding the physical and ecological geography of the Earth.



A Special Publication of the American Association of Geographers