



Quo Vadimus

A new wave of marine evidence-based management: emerging challenges and solutions to transform monitoring, evaluating, and reporting

P. F. E. Addison^{1,2,*}, D. J. Collins^{3,4}, R. Trebilco⁵, S. Howe⁶, N. Bax^{7,8}, P. Hedge⁷, G. Jones^{9,10}, P. Miloslavich^{7,11}, C. Roelfsema¹², M. Sams³, R. D. Stuart-Smith⁷, P. Scanes¹³, P. von Baumgarten¹⁴, and A. McQuatters-Gollop¹⁵

¹Department of Zoology, University of Oxford, Oxford, OX1 3PS, UK

²Australian Institute of Marine Science, Townsville, QLD, 4810, Australia

³Environment Protection Authority Victoria, Macleod, VIC, 3085, Australia

⁴Environment Southland, Invercargill, 9840, New Zealand

⁵Antarctic Climate & Ecosystems CRC, University of Tasmania, Hobart, TAS, 7001, Australia

⁶Parks Victoria, Melbourne, VIC, 3000, Australia

⁷Institute for Marine and Antarctic Studies, University of Tasmania, Hobart, TAS, 7001, Australia

⁸CSIRO Oceans and Atmosphere, Hobart, TAS, 7004, Australia

⁹Tasmania Parks and Wildlife Service, Hobart, TAS, 7001, Australia

¹⁰Geography and Spatial Sciences, School of Land and Food, University of Tasmania, Hobart, TAS, 7001, Australia

¹¹Departamento de Estudios Ambientales, Universidad Simón Bolívar, Caracas, 1080, Venezuela

¹²Remote Sensing Research Centre, School of Earth and Environmental Sciences, The University of Queensland, QLD, 4072, Australia

¹³Water Wetland and Coastal Science, Office of Environment and Heritage, Sydney, NSW, 2000, Australia

¹⁴Department of Environment, Water and Natural Resources, Adelaide, SA, 5000, Australia

¹⁵Centre for Marine and Conservation Policy Research, Plymouth University, Plymouth, PL4 8AA, UK

*Corresponding author: tel: +44 (0)1865271102; e-mail: prue.addison@zoo.ox.ac.uk.

Addison, P. F. E., Collins, D. J., Trebilco, R., Howe, S., Bax, N., Hedge, P., Jones, G., Miloslavich, P., Roelfsema, C., Sams, M., Stuart-Smith, R. D., Scanes, P., von Baumgarten, P., and McQuatters-Gollop, A. A new wave of marine evidence-based management: emerging challenges and solutions to transform monitoring, evaluating, and reporting. – ICES Journal of Marine Science, doi:10.1093/icesjms/fsx216.

Received 20 July 2017; revised 8 November 2017; accepted 9 November 2017.

Sustainable management and conservation of the world's oceans requires effective monitoring, evaluation, and reporting (MER). Despite the growing political and social imperative for these activities, there are some persistent and emerging challenges that marine practitioners face in undertaking these activities. In 2015, a diverse group of marine practitioners came together to discuss the emerging challenges associated with marine MER, and potential solutions to address these challenges. Three emerging challenges were identified: (i) the need to incorporate environmental, social and economic dimensions in evaluation and reporting; (ii) the implications of big data, creating challenges in data management and interpretation; and (iii) dealing with uncertainty throughout MER activities. We point to key solutions to address these challenges across MER activities: (i) integrating models into marine management systems to help understand, interpret, and manage the environmental and socio-economic dimensions of uncertain and complex marine systems; (ii) utilizing big data sources and new technologies to collect, process, store, and analyze data; and (iii) applying approaches to evaluate, account for, and report on the multiple sources and

© International Council for the Exploration of the Sea 2017.

This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/4.0/>), which permits unrestricted reuse, distribution, and reproduction in any medium, provided the original work is properly cited.

types of uncertainty. These solutions point towards a potential for a new wave of evidence-based marine management, through more innovative monitoring, rigorous evaluation and transparent reporting. Effective collaboration and institutional support across the science–management–policy interface will be crucial to deal with emerging challenges, and implement the tools and approaches embedded within these solutions.

Keywords: adaptive management, biodiversity, fisheries, collaboration, environment, environmental impact assessment, modelling, monitoring, socio-economic.

Introduction

In order to more sustainably manage and conserve biodiversity and marine resources in the world's oceans, there has been a push from marine practitioners to implement evidence-based management, where scientific evidence from monitoring and research is used to inform more robust and transparent management decisions. Monitoring, evaluation, and reporting (hereafter collectively referred to as MER) are critical stages of evidence-based management, which focus on assessing environmental state and pressures, evaluating management effectiveness, publicly reporting findings, demonstrating public accountability, and delivering the evidence-base to inform adaptive management (Pomeroy *et al.*, 2005; Ferraro *et al.*, 2006; Levin *et al.*, 2009; Jones, 2015). The decision-making processes that MER activities are commonly packaged within include: ecosystem-based fisheries management (Long *et al.*, 2015), state-dependent conservation management (Nichols and Williams, 2006), and adaptive management of natural resources (Holling, 1978).

Marine environmental monitoring has a relatively long history in the environment sector, with some monitoring programmes now running for almost 90 years (e.g. the Continuous Plankton Recorder surveys; McQuatters-Gollop *et al.*, 2015). Although some of these early monitoring programmes commenced as surveillance exercises to discover and explore the marine environment, more recently there has been a push to ensure the monitoring programmes are fit-for-purpose to inform management needs (i.e. through evaluation and reporting activities to address evidence-based management; Pomeroy *et al.*, 2005; Ferraro *et al.*, 2006; Nichols and Williams, 2006). The imperative for MER and evidence-based management is now reflected in international conventions [e.g. Convention for Biological Diversity (CBD, 2011) and the Convention for the Protection of the Marine Environment of the North-East Atlantic; OSPAR, 1992]; which, has flowed through to national and regional policy drivers for marine MER [e.g. the European Marine Strategy Framework Directive (European Commission, 2008) and the US Federal Water Pollution Control Act (USC, 2002)]. MER activities will be increasingly required as countries report their progress against the United Nations Sustainable Development Goals, and will be critical in the future management of biodiversity beyond national jurisdiction currently being negotiated at the UN (Druel and Gjerde, 2014).

Marine MER activities can be integrated within a single programme, but in many cases these activities are undertaken completely separately (e.g. undertaken and funded by different organizations). For example, many monitoring programmes in the Great Barrier Reef are undertaken by scientists from research institutions for a variety of reasons (e.g. scientific research through to citizen science engagement), and results from these programmes are drawn upon by responsible marine decision-makers in evaluation and reporting programmes like the Great

Barrier Reef Outlook assessment (GBRMPA, 2014). The spatial extent of MER activities ranges from local through to global, and their temporal extent can be short-term through to on-going; these activities vary in extent depending on whether they are designed to address discrete management issues or support on-going management of the marine environment.

There are now many notable examples of marine MER activities around the world, that are compiled in outputs such as the recent global assessment of ocean health (OHI, 2017), the State of Europe's Seas (EEA, 2017), and the Great Barrier Reef Outlook assessment (GBRMPA, 2014). In parallel, there has been increasing focus and co-ordination at both national and international levels to develop standardized methods for monitoring ecosystem variables, in order to quantify ecosystem status and trends to inform evaluation and reporting and ultimately feed into evidence-based management. Notable examples include the Reef Life Survey (Stuart-Smith *et al.*, 2017), Integrated Marine Observing System (IMOS, 2016), the Integrated Framework for Sustained Ocean Observing (IFSOO, 2012), Essential Ocean Variables (Lindstrom *et al.*, 2012) and ecosystem Essential Ocean Variables (Constable *et al.*, 2016), and Essential Biodiversity Variables (Pereira *et al.*, 2013).

Drawing on elements of the notable examples outlined earlier and research into best-practice MER and evidence-based management (Nichols and Williams, 2006; Kemp *et al.*, 2012; Hallett *et al.*, 2016; Hedge *et al.*, 2017), there are at least seven important characteristics that define effective marine MER: (i) Having clear management objectives (e.g. related to conservation of biodiversity, sustainable harvest of natural resources, or threat reduction) and monitoring objectives (i.e. to measure key indicators related to management objectives); (ii) Having robust monitoring programme design, with targeted monitoring data to assess progress towards objectives and evaluate management effectiveness; (iii) Having the capacity to incorporate various data sources (e.g. quantitative and qualitative monitoring data, traditional ecological knowledge and expert judgement); (iv) Undertaking routine evaluation and reporting of monitoring results; (v) Producing accessible reporting for public outreach (e.g. report cards), which demonstrates progress towards achieving objectives and provides access to more detailed monitoring and evaluation reports; (vi) Allowing for adaptation in response to changing environmental conditions and management needs (i.e. adaptive management); and (vii) Securing long-term funding for MER activities that extend beyond political cycles.

Despite the growing political and social imperative for MER, and the rise in MER approaches employed around the globe, there are some persistent challenges to implementing and undertaking successful marine MER activities. There are institutional challenges, such as: a lack of stability in resources to fund MER activities through time, which means that the time-frame of many important ecological changes will not be detected by MER

activities (Duarte *et al.*, 1992; Ferraro *et al.*, 2006); a continued failure to set clear management, monitoring and evaluation objectives (Kemp *et al.*, 2012; Fox *et al.*, 2014); and, persistent difficulties in accessing fit-for-purpose environmental monitoring data, successfully evaluating different types of monitoring data, and “closing the loop” to ensure the results of monitoring and evaluation informs evidence-based management (Fox *et al.*, 2014; Addison *et al.*, 2015). Scientific challenges also exist that limit the ability of marine MER activities to inform evidence-based management, which include the challenge of monitoring extensive, remote environments, poor scientific understanding of large-scale ecological processes and interactions, uncertainty in the attribution of cumulative impacts of threats, and in understanding the effectiveness of management interventions (Cvitanovic *et al.*, 2015; Addison *et al.*, 2017). Some of these persistent challenges represent the reality of organizational constraints that MER practitioners must work within, whereas other challenges are being addressed by scientific advancements and sharing best-practice lessons (Ferraro *et al.*, 2006; Cvitanovic *et al.*, 2015; Addison *et al.*, 2017). However, there are emerging challenges in the field of evidence-based marine management that are yet to be comprehensively addressed in the peer-reviewed literature, and require inter-disciplinary solutions to help progress marine MER activities.

Today’s practitioners involved in marine MER work across the science–management–policy interface, and include scientists, decision-makers (i.e. managers and policy-makers), and knowledge brokers from government agencies, non-governmental organizations, academic institutions, and consultancies. This diversity in practitioners means that historically some marine MER challenges have been slow to overcome, as communication and collaboration has been limited across the science–management–policy interface. However, this diversity in practitioners means that a range of technical, managerial, and political skills can be used to advance MER in the face of emerging challenges in this evolving area of evidence-based marine management (Thébaud *et al.*, 2017).

A diverse group of marine MER practitioners from universities, government agencies, and consultancies, came together at the 2015 Australian Marine Sciences Association conference to discuss the emerging challenges and novel solutions for marine MER. This group of practitioners shared common ground in wanting to share experience and expertise to improve the management and protection of the marine environment. Here we synthesize the discussions, identifying three critical and emerging challenges facing today’s marine practitioners. We then propose solutions to these challenges and in doing so offer a vision for a new wave of marine MER within evidence-based management.

Emerging challenges facing marine MER

Emerging challenge 1: integrating environmental, social, and economic MER

Traditionally, marine MER activities have focussed on assessing the environmental variables in the marine environment across the water quality, fisheries and biodiversity management sectors (e.g. FAO, 2003; Hering *et al.*, 2010; Tett *et al.*, 2013; USEPA, 2015). Monitoring and evaluating environmental variables, such as water quality, habitat quality, ecosystem condition, and species abundance have come with a range of challenges, which include understanding and assigning causality of complex interactions in

marine ecosystems, and developing suitable indicators to cut through the complexity and deliver simplified measures of environmental change (McQuatters-Gollop, 2012; Constable *et al.*, 2016; Stuart-Smith *et al.*, 2017). However, social and economic aspects of marine systems are increasingly being considered in the management of the marine environment, with the recognition that true sustainability needs to balance these aspects with the often opposing needs for ecological sustainability (Thébaud *et al.*, 2017).

The social and economic dimensions of marine systems are vitally important to consider as humans have a range of connections, dependencies, and conflicts with the environmental dimension of marine systems (Marshall *et al.*, 2016). For example, people can be financially and culturally dependent on the marine environment, which means that society and economy can draw direct benefits from oceans (e.g. community wellbeing, and livelihoods dependent on natural resources), but this dependence can also impact marine ecosystems (e.g. through unsustainable resource use; Marshall *et al.*, 2016). Consideration of socio-economic and environmental dimensions is critical for evidence-based management, as these dimensions are often competing, thus trade-offs between dimensions will be made—whether decision-makers deal with trade-offs transparently or not. Integration in evaluation (e.g. through modelling) or reporting (e.g. through dashboards or integrated reporting) allows for interdependencies, interactions, and feedbacks between critical environmental, social and economic indicators to be explicitly considered. For example, integrated modelling of Essential Ocean Variables in the Southern Ocean is helping scientists and decision-makers explore and understand ecosystem dynamics in light of human pressures and physico-chemical properties, to help attribute drivers of change and make predictions about future changes that may require management (Constable *et al.*, 2016).

Integrating the environmental, social, and economic dimensions within marine MER activities requires a great breadth of technical skills and knowledge, and the data generated from these different spheres do not necessarily lend themselves to integration. To date, the best efforts that have been made to incorporate environmental, social, and economic assessments within reporting programmes have involved a silo approach. This is where environmental, social, and economic monitoring data are evaluated and reported separately, with some attempt to synthesize these during the reporting phase—often just verbally. Examples of these evaluation and reporting approaches include the Great Barrier Reef Outlook Report (GBRMPA, 2014), marine assessments by the Intergovernmental Panel on Climate Change (Pörtner *et al.*, 2014), and the World Oceans Assessment (United Nations, 2016), and the French marine protected areas dashboard (Agence des Aires Marines Protégées, 2014).

There are very few examples of integrated assessments of environmental and socio-economic factors, such as where evaluations enable trade-offs between environmental, social, and economic variables (but see: Weijerman *et al.*, 2015 for a coral reef example). Beyond the challenges of integrating the evaluation of these different components, reporting this variety of information presents further challenges such as ensuring integrated reporting is factually reliable, aligned with management objectives, and communicates key messages clearly and simply to a broad range of audiences including the general public, marine managers, and politicians.

Emerging challenge 2: MER and the world of big data

The collection, analysis, storage, and visualization of data are fundamental to marine MER. Early marine monitoring programmes faced the challenges associated with intensive data collection and analysis, which due to resource constraints, often focussed on a limited number of metrics over a small number of sites. Since then, an increased focus on marine management has fuelled the need for a greater diversity of information about marine systems (Ducrotoy and Elliott, 1997). Subsequently, marine monitoring programmes have become more complex, looking at additional physical, chemical, and biological factors, often with an increased volume of data collected through monitoring and generated from modelling (De Jonge et al., 2006).

Increases in data volume and complexity have also originated from advances in monitoring technology (Vitolo et al., 2015). Modern *in situ*, continuous, and remote sensing technologies (e.g. long-term deployed probes, autonomous systems, and higher resolution satellite imagery) offer increasingly larger volumes of information for scientists and environmental decision-makers (Kogan et al., 2011). Improvements in technology also extend to loggers, autonomous vehicles, telemetry networks, and databases, and this is revolutionizing the way data are collected, transmitted, and stored. Rapid data availability brings a range of advantages to managers, and can enable dynamic ocean management where responses to changes in monitored social and environmental variables can be made in near real-time (e.g. in fisheries management in Australia and the United States, and marine conservation management in the United States; Maxwell et al., 2015).

Despite the benefits of big data, this new world also presents a number of challenges for marine management organizations. Additional human capacity and expertise is required to ensure data quality can be assured for decision making purposes (e.g. daily checking of data plots, regular cleaning and maintenance and validation against samples to achieve the required data quality). Many organizations have also found that their systems; designed to process and store relatively simple and discrete monitoring data, have proven unsuitable in the face of institutional changes and rapidly evolving technologies. These systems lack the required architecture, complexity, and processing speed for handling the volumes and variety of new data. For example, datasets may now include images, audio, video, and spatial data, along with the traditional environmental variables stored as numbers and text characters, and qualitative data in the form of expert judgement and traditional knowledge. The outputs of modelled data add another challenge as they can easily take up terabytes of storage and are not always recognized as valuable datasets requiring appropriate metadata and management in their own right.

There are a range of technologies now emerging for processing large datasets, such as more flexible web-based and geo-spatial databases that can facilitate large volumes of heterogeneous environmental data (Vitolo et al., 2015). However, the increasing scope of data collected and the potential future purposes for which it will be used, means that established tools and processes for collecting, storing and analysing datasets may become increasingly bespoke, particularly if the trend for repurposing data continues (e.g. the use of artificial intelligence and machine learning to extract new information from existing databases). The need for ever more sophisticated data processing makes it even harder to

meet the open data standards, which are needed going forward to make data accessible and synoptic analyses possible.

Emerging challenge 3: the challenge of uncertainty throughout MER activities

Uncertainty is a pervasive challenge for marine practitioners across all stages of marine MER. Uncertainty is the incompleteness of knowledge, or lack of certainty in understanding and managing marine systems. Drawing on uncertainty research (Regan et al., 2002; Kujala et al., 2013), we classify three (non-mutually exclusive) types of uncertainty relevant to marine MER activities: (i) epistemic uncertainty—the gaps in knowledge or lack of certainty in socio-ecological system understanding (both current state and future regime shifts), uncertainty in the measurement of ecosystems, and uncertainty in model representation; (ii) linguistic uncertainty—vagueness or ambiguity in terms, expressions or concepts used to develop objectives, select indicators and interpret monitoring results; and (iii) decision-making uncertainty—subjective judgment and human preferences that can influence or bias indicator or model parameter selection, choice of normalization of monitoring data, and model interpretation (Table 1).

Uncertainty is present across all stages of marine MER, and can influence activities such as: setting management objectives (e.g. influenced by linguistic uncertainty, where a vagueness of terms used in management objectives can have very different meanings to different people); monitoring programme design (e.g. influenced by epistemic uncertainty, where information gaps, lack of certainty about ecosystem processes, and natural variation will influence monitoring programme design); model design and parameterization (e.g. influenced by epistemic and decision-making uncertainty, where subjective human judgement can influence the type of model and parameters included in models; Table 1).

Models and the modelling process are themselves important sources of uncertainty, but, if used appropriately, they offer opportunities to explicitly consider and account for uncertainty by exploring and clarifying epistemic uncertainty in system understanding, monitoring programme design, and decision-making rules. Another key opportunity for better dealing with uncertainty is improving decision-making processes using participatory methods and approaches to elicit expert judgement to reduce subjective bias, linguistic uncertainty and decision-making uncertainty (see further discussion in Solutions 1 and 3). Despite opportunities and methods to robustly consider and account for uncertainty, scientists and managers alike commonly fail to account for uncertainty. Common traps evident in environmental science and management include: completely ignoring the influence of uncertainty in monitoring data and in decision-making, addressing an incomplete set of more trivial uncertainties in models, believing that models represent the truth, and failure to set clear objectives (Milner-Gulland and Shea, 2017).

An emerging issue for marine MER activities is how to address uncertainty in reporting of monitoring results, as this is subject to epistemic, linguistic and decision-making uncertainty (Table 1). Report cards are a common output of MER activities, which often include ratings of condition of environmental or socio-economic indicators to reflect the status and trends in environmental and socio-economic attributes (e.g. GBRMPA, 2014; Carey et al., 2017). Report cards help simplify complex

Table 1. A taxonomy of uncertainty affecting marine MER.

Type of uncertainty	Issue	Various stages of MER that can be influenced by uncertainty						
		Setting management objectives	Indicator selection	Monitoring programme design	Model design and parametrization	Interpretation of monitoring data and model outputs	Reporting monitoring results	Evidence-based management
Epistemic uncertainty	<i>Gaps and lack of socio-ecological system understanding</i> e.g. information gaps and lack of certainty about ecosystem processes, such as ecosystem interdependencies, interactions, and feedbacks between variables <i>Natural variation, measurement or systematic error</i> e.g. the natural variability of socio-ecological systems, and the uncertainty that arises from monitoring (i.e. measurement error) and modelling these systems (i.e. systematic error) <i>Model structure uncertainty</i> e.g. representation (or lack of representation) of socio-ecological variables in models	•	•	•	•	•	•	•
Linguistic uncertainty	<i>Vagueness or ambiguity in terms, expressions or concepts</i> e.g. vagueness and ambiguity in the description of management objectives; ambiguity in indicator selection (based on different interpretation of objectives); and ambiguity of ecosystem concepts in reporting of monitoring results	•	•	•	•	•	•	•
Decision-making uncertainty	<i>Subjective judgement and uncertain preferences</i> e.g. the human values and subjective judgment that can influence or bias decision-making (i.e. in indicator or model parameter selection, choice of normalization of monitoring data, approach to weighting or aggregating indicators (e.g. in composite indicators or multi-objective models), and in the interpretation of model outputs)	•	•	•	•	•	•	•

monitoring information for public reporting to a broad audience ranging from scientists, to policy-makers and the general public. They commonly present colour coded condition assessments of environmental or socio-economic indicators. Although these reporting formats provide clear and simple messages, this perceived simplicity can be misleading as uncertainty associated with environmental or socio-economic attributes can be completely hidden, and ecosystem complexities (e.g. multi-state systems) can be over-simplified. The failure to explicitly communicate uncertainty in report cards can arise from: (i) the motivation to present simple results in report cards (i.e. hiding error bars), and (ii) the incorrect treatment of uncertainty in underlying models used in evaluations that are presented in report cards (i.e. epistemic uncertainty not incorporated into model parameters). Either way, the outcome of failing to deal with uncertainty can mean that readers, including managers, policy-makers, and the general public may be misled by interpreting results with false certainty (e.g. with a water quality report card: [Queensland Audit Office, 2015](#)).

Solutions for a new wave of marine MER to support evidence-based management

The field of MER has evolved considerably over the last decade, but addressing the challenges we have outlined above requires innovative solutions. We believe the solutions proposed here will assist with developing and sustaining MER activities so that they meaningfully inform the development of policy and implementation of evidence-based management of the marine environment. Marine practitioners with a diverse range of expertise will need to effectively collaborate across the science–management–policy interface to implement the recommended solutions. Thus, we cannot stress enough the human dimension of our solutions, in the form of effective collaboration and enabling political conditions, and their critical role in the implementation of these solutions to support a new wave of marine MER and evidence-based management.

Solution 1: integrating modelling and monitoring to maximize MER activities in evidence-based management

An integration of data and models should be at the core of MER activities. Data-integrated modelling applications have been

extensively used in this context in some marine sectors, like fisheries management ([Link et al., 2002](#); [Collie et al., 2014](#)), and are a core component of adaptive management ([Addison et al., 2013](#)), but uptake has been less widespread in other marine sectors. In some cases this may be because marine monitoring data have not been available or adequately targeted to address marine management needs ([Fox et al., 2014](#); [Hedge et al., 2017](#)), but in other cases it may be because marine practitioners have not been aware of, or have not had access to, the full suite of models that could support management decisions, and may not have considered modelling as complementary to monitoring.

Models are abstractions of real world phenomena that can help make environmental and socio-economic processes easier to understand. One model will never suit all applications; rather a toolbox of models of different types, complexity and scope are often required to support environmental management ([Table 2](#)). Models can span a range of complexity from simple conceptual models that help formalize and clarify our understanding of how systems work (e.g. used in the scoping and monitoring phases), to statistical models that help interpret monitoring data and quantify patterns and associations in systems (e.g. used in the evaluation and reporting phases), through to mechanistic models that can mathematically represent real-world processes (e.g. used to inform the management response phase). A toolbox of models can assist with integrating multiple lines of evidence (e.g. expert judgement, traditional knowledge, and monitoring or research outputs), reducing or highlighting epistemic or linguistic uncertainty, evaluating alternative decision scenarios, and clarifying cause and effect relationships for marine practitioners to better understand and manage marine systems. Furthermore, spatially explicit and dynamic mechanistic models (e.g. oceanographic/hydrodynamic models and species distribution models) can allow us to evaluate processes and environmental condition on scales that are much larger than can generally be achieved through monitoring alone.

Models are not a panacea, and on their own cannot drive marine MER activities towards more robust evidence-based management. If not well understood, model outputs can easily be misinterpreted and used incorrectly to inform decision-making. For example, a recent study of papers reporting marine socio-ecological model forecasts found that the majority (90%) failed

Table 2. Types of models and their application through the different stages of marine MER activities.

MER phase	Qualitative and conceptual models	Statistical models	Dynamic and mechanistic models
Monitoring	<ul style="list-style-type: none"> Assist with indicator selection (e.g. conceptual and systems models). 	<ul style="list-style-type: none"> Understand patterns and interactions when selecting indicators (e.g. statistical analysis of historic data, or meta-analysis of published results). Inform monitoring programme design (e.g. power analysis using baseline monitoring data or published results). 	<ul style="list-style-type: none"> Inform indicator and target selection (e.g. ecosystem models). Inform monitoring strategy (e.g. observation models). Inform monitoring programme design (e.g. model evaluation of monitoring strategies).
Evaluation	<ul style="list-style-type: none"> Understanding surprises (e.g. conceptual models). Distinguishing mechanisms of change. 	<ul style="list-style-type: none"> Understand patterns of monitored indicators (e.g. statistical analysis of monitoring data). Support model choice where alternative models exist. 	<ul style="list-style-type: none"> Extrapolating monitoring data over larger scales (with accompanying estimates of uncertainty).
Reporting	<ul style="list-style-type: none"> Displaying ecosystem interactions between threats, ecosystem status and management responses (e.g. conceptual models). 	<ul style="list-style-type: none"> Display temporal or spatial patterns in monitored indicators (e.g. statistical model outputs). 	<ul style="list-style-type: none"> Display modelled results.

to account for uncertainty in the interpretation of model outputs, which can have profound effects on decisions based on model outputs (GREGG and CHAN, 2014). For models to be useful in evidence-based management, they require effective collaboration between marine practitioners to ensure that models are developed within existing management frameworks, and that models of appropriate scope and complexity are used to address management questions (ADDISON *et al.*, 2013; CARTWRIGHT *et al.*, 2016). Examples where models have been integrated into management frameworks, include: the use of fisheries models to set catch limits worldwide (TITTENSOR *et al.*, 2017); the use of statistical models within an adaptive management process for protected areas in Australia (CAREY *et al.*, 2017); and the Atlantis model, which is a representation of the management strategy evaluation cycle (including a full end-to-end ecosystem model) and is used operationally to inform marine ecosystem management decisions in both Australia and the United States (FULTON *et al.*, 2011).

Developing “toolboxes” of models will help marine practitioners explore how to better understand the system they are managing, use existing monitoring evidence to test their understanding, and subsequently in management, potentially identify where more or different monitoring and evaluation techniques are required. Model toolbox (or ensemble) approaches are also essential for overcoming the emerging challenge associated with integrating environmental, social and economic aspects of MER [Emerging challenge 1; e.g. previously called for in marine natural resource and conservation management (Melbourne-Thomas *et al.*, 2011; Long *et al.*, 2015; Marshall *et al.*, 2016)]. There are currently relatively few examples where models have simultaneously incorporated environmental and socio-economic variables in evaluation and reporting stages of MER. However, some notable examples that are emerging include: conceptual models to define complex socio-ecological systems (e.g. conceptual models developed by stakeholders for Australian marine park management, to explore and document perceptions of critical ecological and socio-economic values and pressures in marine systems; Bryars *et al.*, 2016); through to more complex, dynamic whole-of-ecosystem models to test and predict ecological and socio-economic dynamics [e.g. ecosystem models used to inform ecosystem-based management, such as Atlantis (Fulton *et al.*, 2011), Ecopath with Ecosim (Heymans *et al.*, 2016), and CORSET (Melbourne-Thomas *et al.*, 2011)].

Integration of environmental and socio-economic variables in evaluation and reporting stages of MER does not solely rely on a one-way process of feeding data into models. There are also exciting developments in platforms (models with user-friendly, visual displays) that can process and display environmental and socio-economic data in an interactive dashboard. Such models are important to support interpretation and uptake for more rapid and effective evidence-based management. For example, the dynamic ocean management applications outlined in Maxwell *et al.* (2015), such as the Turtle Watch programme in Hawaii that displays information on temperature fronts and satellite tracking of loggerhead sea turtles to help guide reduced turtle bycatch in local fisheries.

The toolbox of models approach we propose to support MER activities will also help address the emerging challenge of big data, as statistical models become critical for dealing with increasing volumes of data and modelling complex natural system patterns (Spiegelhalter, 2014; addressing Challenge 2). For example, Markov, Bayesian and dynamic modelling are being used to help

predict (and not just observe) species distributions, population dynamics, and inform biodiversity management, by drawing on increasingly larger datasets (Gimenez *et al.*, 2014).

The use of multiple modelling approaches can also help support marine managers in clarifying uncertainties in interpreting monitoring data (helping overcome Challenge 3; Table 2). For example, a diverse set of qualitative models was used to explore and test sources of epistemic and linguistic uncertainty associated with the system dynamics of Australia’s commonwealth waters, where the level of system knowledge varied greatly between environmental assets. This allowed the selection of asset-specific indicators to inform monitoring programme designs (Hayes *et al.*, 2015).

Finally, using a toolbox of models is also a good way to explore model structure (epistemic) uncertainty (Challenge 3), by considering variability of outcomes from different modelling approaches. Importantly, this requires that there is actually structural diversity among the models, and the same assumptions and flaws are not present in all models and simply being represented in different ways (GREGG and CHAN, 2014).

Solution 2: working effectively in the world of big data

Some of the most prevalent opportunities that have arisen for marine monitoring programmes over the last decade have come through improvements across the data life-cycle. Of particular note are advances in the technology and systems for data collection, transmission, management, processing, and analysis. These advances have opened doors for novel and more cost-effective monitoring techniques, which are seen in regional and global collaborative projects dedicated to observing and measuring ocean attributes (IFSOO, 2012; Meredith *et al.*, 2013; Constable *et al.*, 2016; IMOS, 2016). Combining some of these technologies offers a previously unheard-of range of options available to MER practitioners to collect high-quality data, that capture daily, seasonal, annual and event-based environmental variability, and in some cases, inform real-time marine management (Maxwell *et al.*, 2015; Edgar *et al.*, 2016). It is not just technology that is contributing to the big data era—people are too. The management of big data requires new collaborations between marine practitioners and data scientists with expertise in programming languages and packages like R and Python. These new collaborations are making it possible to manage and analyze extremely large, complex datasets to inform marine evidence-based management.

Citizen science offers another area of growth for marine data collection and analysis (Gimenez *et al.*, 2014). Citizen science uses volunteers to collect and/or analyze data, and cost-effectively increase research capacity and potentially fill data gaps (e.g. in scientific monitoring programmes) over large geographic areas (Bird *et al.*, 2014; Vann-Sander *et al.*, 2016; Stuart-Smith *et al.*, 2017). Many citizen science programmes are beginning to supplement traditional modes of field data collection with mobile phone apps, which are a versatile data collection tool supported by mobile capabilities like GPS, camera, clock, and data storage (e.g. Marine Debris Tracker, 2017; Project Seagrass, 2017; Secchi Disk, 2017). There have sometimes been concerns over the quality of citizen science datasets (Vann-Sander *et al.*, 2016). Data quality is not an issue confined to citizen science, however, and there is growing recognition of effective ways to tackle issues of data quality, which include adequate training of data collectors, quality control mechanisms for collected data, and statistical

consideration of data quality or observer error during analysis and interpretation (e.g. as addressed in the Reef Life Survey citizen science programme; Edgar and Stuart-Smith, 2009; Bird et al., 2014). Collaboration between marine practitioners and new partners, like citizen scientists, are opening up new opportunities to bring additional information into marine MER activities.

Improved modes of data collection form only part of the digital age innovations for marine MER, and in response to the rise in big data, non-relational databases are now emerging to help deal with the ever-increasing volume of complex and varied data (Vitolo et al., 2015). A crucial aspect of these databases is metadata, which allow data to be more confidently used in the future, potentially in ways not envisaged by the original collector, and as more powerful and innovative analytical techniques are developed (e.g. Seeley et al., 2009). A vast array of modelling techniques matched with online technologies now exist to support the processing of large and multidimensional datasets (Maxwell et al., 2015; Vitolo et al., 2015).

It is impossible for MER practitioners to be experts in the varied fields required to be able to effectively interpret and most effectively apply data from varied sources to management processes. Thus, collaboration is a key to fully utilize the increasing volume and variety of data available to inform marine MER. Many bespoke data management solutions are emerging (Vitolo et al., 2015), but the next step for marine MER practitioners will be to share and create best-practice data management and sharing standards in the world of big data.

Digital datasets, especially those available online, now offer marine practitioners access to a wealth of information that would have been previously inaccessible. Examples include the Ocean Biogeographic Information System, the Australian Ocean Data Network and a variety of government data portals. This increased accessibility becomes even more valuable when we consider MER practitioners looking to work across environmental, social, and economic spheres. Although this sort of data sharing and accessibility is yet to be uniformly adopted by individuals or organizations (Huang et al., 2012), it is at least recognized that there is a growing trend for MER practitioners willing to share their data (Wallis et al., 2013). Furthermore, governments are embracing open access data and requiring publicly funded institutes to make their data accessible to the public. The next challenge to be tackled is how to encourage and facilitate the sharing of environmental data collected by industry, such as commercial fisheries and proponents undertaking environmental impact assessment, where access to these data is commonly restricted by commercial-in-confidence clauses. Responsible and effective use of shared monitoring data will require: strict data quality assurance/quality control procedures to ensure the quality of data prior to sharing (Addison, 2010), standardized metadata specifying essential details of the data to minimize potential for mis-use (Vitolo et al., 2015), approaches to protect commercial-in-confidence elements, and a robust data sharing policy that benefits both the user and data provider by supporting the ongoing funding of the data collection (Juffe-Bignoli et al., 2016).

Solution 3: approaches to evaluate, account for, and report on uncertainty in MER

Environmental management is subject to diverse sources of uncertainty (e.g. epistemic, linguistic and decision-making uncertainty), which affects all stages of marine MER (Challenge 3;

Table 1). During the evaluation phase, a range of models can be used to help interpret patterns in environmental condition (Table 2), and statistical models have the functionality to robustly explore and account for epistemic uncertainty. As mentioned in Solution 1, model simulations, sensitivity analysis or Bayesian methods can help account for epistemic uncertainty and in the interpretation of environmental patterns detected in statistical models (e.g. Spiegelhalter, 2014; Milner-Gulland and Shea, 2017). Similarly, statistical power analysis can help practitioners understand and account for epistemic uncertainty associated with natural variation, measurement error, and modelling approaches (Gimenez et al., 2014; Milner-Gulland and Shea, 2017).

Mechanistic models can be used to make predictions about environmental responses to a range of management interventions, and test the effect of epistemic uncertainty associated with model parameters (e.g. using Monte Carlo simulation)—helping identify parameters that may need additional data and testing to help understand natural system dynamics (Fulton et al., 2011; Heymans et al., 2016). Finally, model inter-comparisons and ensemble approaches (e.g. using statistical models to combine outputs from multiple mechanistic models) can account for structural uncertainty associated with individual models, by considering whether structurally distinct models give consistent or divergent results, and thus can help resolve epistemic uncertainty in system understanding and model representation.

Models cannot, however, directly address linguistic and decision-making uncertainty. Instead, this is where the human dimension of decision-making dominates, and where structured decision-making processes and expert elicitation methods can be used to reduce the influence of linguistic and decision-making uncertainty in objective setting, indicator development and monitoring design. For example, structured decision-making in addition to objectives hierarchies can be used to ensure management objectives and indicators are carefully defined prior to monitoring (Addison et al., 2013). When expert judgement is used (e.g. to inform quantitative model parameters), more structured methods of elicitation can be used to minimize subjective bias and linguistic uncertainty (e.g. the four-step elicitation and Delphi procedure used to elicit judgements from groups of experts; Hemming et al., 2017).

When it comes to reporting uncertainty in socio-ecological assessments, lessons can be learnt from climate reporting. In response to great public and political interest and interrogation of climate change the Intergovernmental Panel on Climate Change provides guidance on reporting uncertainty (Mastrandrea et al., 2010), which includes articulating confidence in the datasets used in assessments as well as in the final interpretation made in the assessment. Confidence is already communicated by some notable marine report cards from Australia, Europe, and the United States (PIFSC, 2016; EEA, 2017; Karnauskas et al., 2017). Drawing on lessons from these report cards, we recommend: (i) use of categorical estimates of confidence to support condition and trend assessments made by experts or estimated from monitoring data [e.g. Victorian MPA assessments include confidence categories 0–25, 26–50, 51–75, and 76–100%; Carey et al. (2017), and State of Europe's Seas assessments include high, medium and low confidence in ecological assessments made (EEA, 2017)]; 2) include a measure of comparability with the previous report card assessments [e.g. the Australian State of Environment Report demonstrates the level of comparability between 2011 and 2016 assessments as comparable, somewhat comparable, not

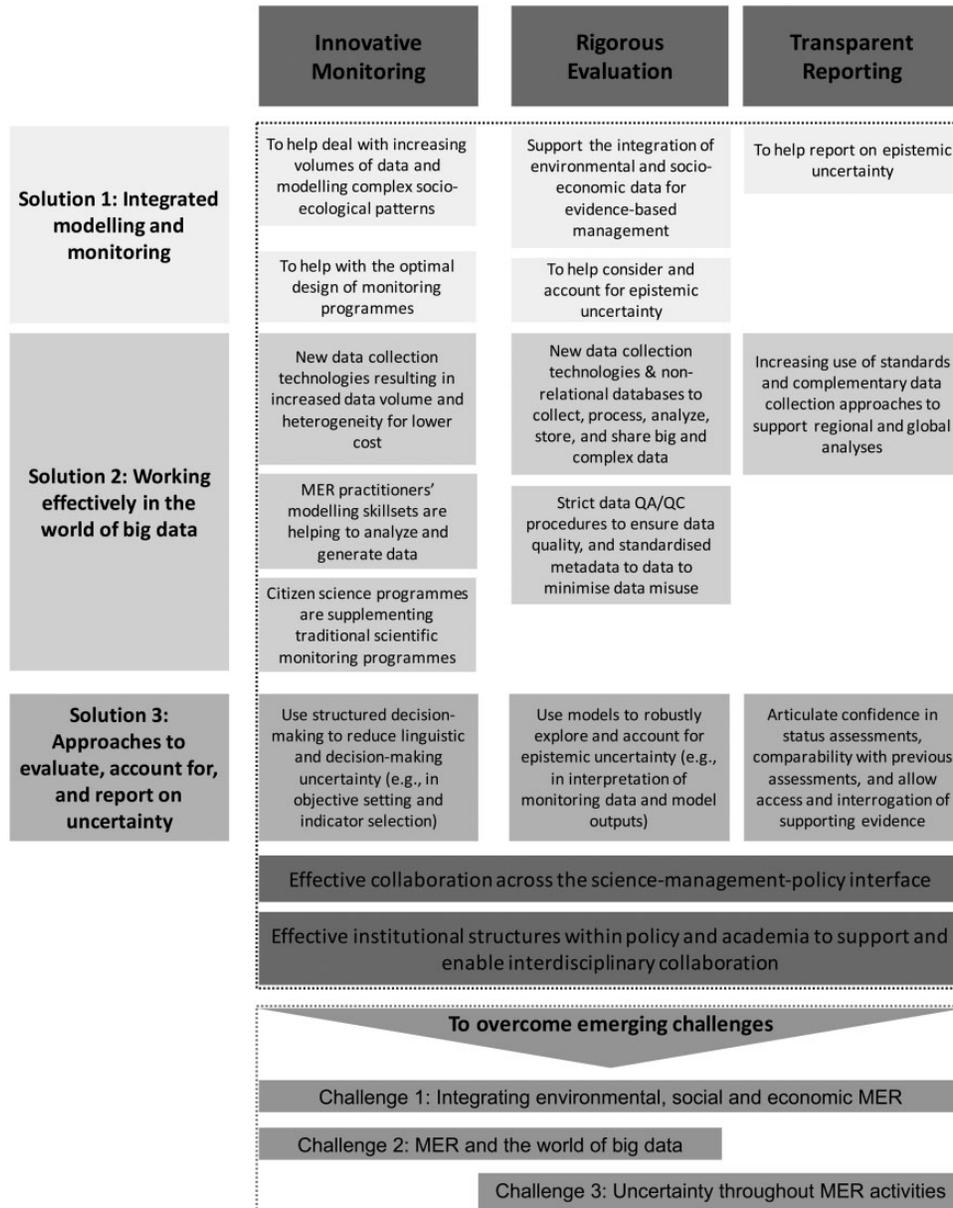


Figure 1. Solutions to support a new wave of MER—towards innovative monitoring, rigorous evaluation and transparent reporting. A conceptual diagram synthesizing the key recommendations made within each of the three solutions.

comparable and not previously assessed; Evans *et al.* (2017)]; and (iii) allow the evidence (e.g. reports and papers) used in assessments to be accessed and considered independently [e.g. the online Gladstone Harbour report card allows full interrogation of supporting monitoring data (GHHP (2016)), and the Ocean Health Index online platform allows users to drill down to evidence used for all assessments (OHI, 2017).

Conclusion: the new wave of MER

MER activities help us understand environmental state and pressures, evaluate management effectiveness, and provide the evidence base to inform management decisions and policy. The growing political and social imperative for MER reflected through international conventions and national policy drivers means that marine MER is no longer an optional activity, but a necessity.

As the number of marine MER approaches employed around the globe has risen, we have witnessed the emergence of challenges associated with MER activities, including: (i) the need to incorporate environmental, social and economic dimensions of the marine environment in evaluation and reporting programmes; (ii) the implications of big and open data creating challenges in the collection, analysis, storage, visualization, and accessibility of data; and (iii) uncertainty throughout MER activities that is not transparently acknowledged or accounted for. These new challenges require innovative solutions to help support a new wave of MER. We have pointed to key solutions that offer a vision for a new wave of more robust and transparent marine MER within evidence-based management: (i) integrating models into marine management systems to help understand, interpret and manage the environmental, social, and economic dimensions of uncertain and complex marine

systems; (ii) utilizing big data sources and new technologies to collect, process, store, and analyze data; and (iii) applying approaches to evaluate, account for, and report on the multiple sources and types of uncertainty in MER (Figure 1).

The successful implementation and application of these solutions requires a diverse range of expertise, thus collaboration is key. Marine MER will increasingly require extensive and effective collaboration across the science–management–policy interface. To facilitate the transfer of technical expertise and information, newer modes of interdisciplinary collaboration and knowledge exchange are required. These will help break the old model of academic scientists working in isolation, employing idiosyncratic techniques that cannot be compared with other studies, with little appreciation of the context and limitations of marine management, and marine managers not having access to or an awareness of new scientific techniques and innovative solutions to progress evidence-based management. New modes of collaboration can occur through: the establishment of boundary organizations or consulting arms of universities to undertake applied research; by embedding research scientists in marine management agencies to work with decision-makers or vice versa; and, by employing knowledge exchange practitioners to help facilitate the multi-directional transfer of knowledge and co-development of fit-for-purpose MER approaches (Michaels, 2009; Cvitanovic *et al.*, 2015). Effective institutional structures within policy (Brooks and Fairfull, 2016) and academia (Keeler *et al.*, 2017) will be critical in supporting and enabling this type of inter-disciplinary collaboration.

Although the diversity of MER activities means that there is no single successful approach to address the multitude of challenges, the solutions, illustrative examples and synthesis of tools provided here offer a pathway towards innovative monitoring, rigorous evaluation and transparent reporting (Figure 1). It will be up to marine practitioners to consider and implement these solutions and make their scientific results increasingly relevant and enduring, thus improving our collective ability to more sustainably manage marine resources and conserve biodiversity in the world's oceans amidst complex management challenges.

Acknowledgements

We wish to acknowledge all of the marine scientists and managers who presented their research and shared their ideas at the Marine Monitoring Evaluation and Reporting symposium at the Australian Marine Sciences Association conference in July 2015. Initial discussions with symposium participants helped shape this article and we thank all of those involved in the symposium for their contributions. We would like to thank the two anonymous reviewers for their helpful comments on an earlier version of the manuscript. PFEA and AMG thank the UK Natural Environmental Research Council for support through the NERC Knowledge Exchange fellowship scheme (NE/N005457/1 & NE/L002663/1). N.B., P.H., and R.D.S.S. were supported by the Marine Biodiversity Hub, a collaborative partnership supported through the Australian Government's National Environmental Science Programme (NESP). R.T. was supported by the R.J.L. Hawke Postdoctoral fellowship.

References

Addison, P. F. E. 2010. Quality assurance in marine biological monitoring. A report prepared for the Healthy and Biologically Diverse Seas Evidence Group and the National Marine Biological

Analytical Quality Control scheme. <http://www.nmbaqcs.org/qa-standards/qa-in-marine-biological-monitoring/> (last accessed 25 November 2017).

Addison, P. F. E., Flander, L. B., and Cook, C. N. 2015. Are we missing the boat? Current uses of long-term biological monitoring data in the evaluation and management of marine protected areas. *Journal of Environmental Management*, 149: 148–156.

Addison, P. F. E., Flander, L. B., and Cook, C. N. 2017. Towards quantitative condition assessment of biodiversity outcomes: insights from Australian marine protected areas. *Journal of Environmental Management*, 198: 183–191.

Addison, P. F. E., Rumpff, L., Bau, S. S., Carey, J. M., Chee, Y. E., Jarrad, F. C., McBride, M. F. *et al.* 2013. Practical solutions for making models indispensable in conservation decision-making. *Diversity and Distributions*, 19: 490–502.

Agence des Aires Marines Protégées. 2014. Marine protected areas dashboard. <http://www.aires-marines.com/Ressources/Marine-protected-areas-dashboard>. Agence des Aires Marines Protégées, France.

Bird, T. J., Bates, A. E., Lefcheck, J. S., Hill, N. A., Thomson, R. J., Edgar, G. J., Stuart-Smith, R. D. *et al.* 2014. Statistical solutions for error and bias in global citizen science datasets. *Biological Conservation*, 173: 144–154.

Brooks, K., and Fairfull, S. 2016. Managing the NSW coastal zone: Restructuring governance for inclusive development. *Ocean and Coastal Management*. doi: 10.1016/j.ocecoaman.2016.1010.1009.

Bryars, S., Brook, J., Meakin, C., McSkimming, C., Eglinton, Y., Morcom, R., Wright, A. *et al.* 2016. Baseline and predicted changes for the Far West Coast Marine Park, DEWNR Technical report 2016/11. Government of South Australia, through Department of Environment, Water and Natural Resources, Adelaide. <https://data.environment.sa.gov.au/Content/Publications/DEWNR-TR-2016-11.pdf> (last accessed 12 June 2017).

Carey, J., Howe, S., Pocklington, J., Rodrigue, M., Campbell, A., Addison, P., and Bathgate, R. 2017. Report on Condition of Yaringa Marine National Park - 2002 to 2013. Parks Victoria Technical Series No. 112. Parks Victoria, Melbourne.

Cartwright, S. J., Bowgen, K. M., Collop, C., Hyder, K., Nabe-Nielsen, J., Stafford, R., Stillman, R. A. *et al.* 2016. Communicating complex ecological models to non-scientist end users. *Ecological Modelling*, 338: 51–59.

CBD. 2011. Convention on Biological Diversity Aichi Biodiversity Targets. <https://www.cbd.int/sp/targets/> (last accessed 11 November 2016).

Collie, J. S., Botsford, L. W., Hastings, A., Kaplan, I. C., Largier, J. L., Livingston, P. A., Plagányi, É. *et al.* 2014. Ecosystem models for fisheries management: finding the sweet spot. *Fish and Fisheries*.

Constable, A. J., Costa, D. P., Schofield, O., Newman, L., Urban, E. R., Fulton, E. A., Melbourne-Thomas, J. *et al.* 2016. Developing priority variables (“ecosystem Essential Ocean Variables”—eEOVs) for observing dynamics and change in Southern Ocean ecosystems. *Journal of Marine Systems*, 161: 26–41.

Cvitanovic, C., Hobday, A., van Kerkhoff, L., Wilson, S., Dobbs, K., and Marshall, N. 2015. Improving knowledge exchange among scientists and decision-makers to facilitate the adaptive governance of marine resources: A review of knowledge and research needs. *Ocean and Coastal Management*, 112: 25–35.

De Jonge, V., Elliott, M., and Brauer, V. 2006. Marine monitoring: its shortcomings and mismatch with the EU Water Framework Directive's objectives. *Marine Pollution Bulletin*, 53: 5–19.

Druel, E., and Gjerde, K. M. 2014. Sustaining marine life beyond boundaries: options for an implementing agreement for marine biodiversity beyond national jurisdiction under the United Nations Convention on the Law of the Sea. *Marine Policy*, 49: 90–97.

Duarte, C. M., Cebrián, J., and Marbà, N. 1992. Uncertainty of detecting sea change. *Nature*, 356: 190.

- Ducrottoy, J.-P., and Elliott, M. 1997. Interrelations between science and policy-making: the North Sea example. *Marine Pollution Bulletin*, 34: 686–701.
- Edgar, G. J., Bates, A. E., Bird, T. J., Jones, A. H., Kininmonth, S., Stuart-Smith, R. D., and Webb, T. J. 2016. New approaches to marine conservation through the scaling up of ecological data. *Annual Review of Marine Science*, 8: 435–461.
- Edgar, G. J., and Stuart-Smith, R. D. 2009. Ecological effects of marine protected areas on rocky reef communities: a continental-scale analysis. *Marine Ecology - Progress Series*, 388: 51–62.
- EEA. 2017. State of Europe's seas. EEA Report No 2/2015. European Environment Agency, Luxembourg.
- European Commission 2008. Marine Strategy Framework Directive 2008/56/EC.
- Evans, K., Bax, N., and Smith, D. C. 2017. Australia State of the Environment 2016: Marine Environment, Independent Report to the Australian Government Minister for the Environment and Energy. Australian Government Department of the Environment and Energy, Canberra.
- FAO. 2003. Technical guidelines for responsible fisheries. Fisheries management fisheries management. 2. The ecosystem approach to fisheries. No. 4, Suppl. 2. FAO Fisheries Department, Rome. 112 PP.
- Ferraro, P. J., Pattanayak, S. K., and Mace, G. 2006. Money for nothing? A call for empirical evaluation of biodiversity conservation investments. *Plos Biology*, 4: 482–488.
- Fox, H. E., Holtzman, J. L., Haisfield, K. M., McNally, C. G., Cid, G. A., Mascia, M. B., Parks, J. E. *et al.* 2014. How are our MPAs doing? Challenges in assessing global patterns in marine protected area performance. *Coastal Management*, 42: 207–226.
- Fulton, E. A., Link, J. S., Kaplan, I. C., Savina-Rolland, M., Johnson, P., Ainsworth, C., Horne, P. *et al.* 2011. Lessons in modelling and management of marine ecosystems: the Atlantis experience. *Fish and Fisheries*, 12: 171–188.
- GBRMPA. 2014. Great Barrier Reef Outlook Report 2014. Great Barrier Reef Marine Park Authority, Townsville. <http://www.gbrmpa.gov.au/cdn/2014/GBRMPA-Outlook-Report-2014/> (last accessed 25 November 2017).
- GHHP. 2016. Gladstone Harbour Report Card 2016. Gladstone Healthy Harbour Partnership. <http://ghhp.org.au/report-cards/2016>.
- Gimenez, O., Buckland, S. T., Morgan, B. J. T., Bez, N., Bertrand, S., Choquet, R., Dray, S. *et al.* 2014. Statistical ecology comes of age. *Biology Letters*, 10: 20140698.
- Gregg, E. J., and Chan, K. M. 2015. Leaps of faith: how implicit assumptions compromise the utility of ecosystem models for decision-making. *Bioscience*, 65: 43–54.
- Hallett, C. S., Valesini, F., and Elliott, M. 2016. A review of Australian approaches for monitoring, assessing and reporting estuarine condition: I. International context and evaluation criteria. *Environmental Science and Policy*, 66: 260–269.
- Hayes, K. R., Dambacher, J. M., Hosack, G. R., Bax, N. J., Dunstan, P. K., Fulton, E. A., Thompson, P. A. *et al.* 2015. Identifying indicators and essential variables for marine ecosystems. *Ecological Indicators*, 57: 409–419.
- Hedge, P., Molloy, F., Sweetman, H., Hayes, K. R., Dambacher, J. M., Chandler, J., Bax, N. *et al.* 2017. An integrated monitoring framework for the Great Barrier Reef World Heritage Area. *Marine Policy*, 77: 90–96.
- Hemming, V., Burgman, M., Hanea, A., McBride, M., and Wintle, B. 2017. Structured expert elicitation using the IDEA protocol. *Methods in Ecology and Evolution*, DOI: 10.1111/2041-210X.12857.
- Hering, D., Borja, A., Carstensen, J., Carvalho, L., Elliott, M., Feld, C. K., Heiskanen, A.-S. *et al.* 2010. The European Water Framework Directive at the age of 10: A critical review of the achievements with recommendations for the future. *Science of the Total Environment*, 408: 4007–4019.
- Heymans, J. J., Coll, M., Link, J. S., Mackinson, S., Steenbeek, J., Walters, C., and Christensen, V. 2016. Best practice in Ecopath with Ecosim food-web models for ecosystem-based management. *Ecological Modelling*, 331: 173–184.
- Holling, C. S. 1978. Adaptive environmental assessment and management, The Blackburn Press, New Jersey.
- Huang, X., Hawkins, B. A., Lei, F., Miller, G. L., Favret, C., Zhang, R., and Qiao, G. 2012. Willing or unwilling to share primary biodiversity data: results and implications of an international survey. *Conservation Letters*, 5: 399–406.
- IFSOO. 2012. A Framework for Ocean Observing. By the Task Team for an Integrated Framework for Sustained Ocean Observing, UNESCO 2012, IOC/INF-1284 rev., doi: 10.5270/OceanObs09-FOO.
- IMOS. 2016. From Observations to Impact. The first decade of IMOS. Integrated Marine Observing System. <http://imos.org.au/> (last accessed 23 November 2017)
- Jones, G. 2015. What's working, what's not: the monitoring and reporting system for Tasmania's National Parks and reserves. *In Science and Stewardship to Protect and Sustain Wilderness Values: Tenth World Wilderness Congress Symposium*, pp. 77–90. Ed. by A. Watson, S. Carver, Z. Krenová, and B. McBride. Salamanca, Spain.
- Juffe-Bignoli, D., Brooks, T., Butchart, S., Jenkins, R., Boe, K., Hoffmann, M., Angulo, A. *et al.* 2016. Assessing the cost of global biodiversity and conservation knowledge. *PLoS ONE*, 11: e0160640.
- Karnauskas, M., Kelble, C. R., Regan, S., Quenée, C., Allee, R., Jepson, M., Freitag, A. *et al.* 2017. Ecosystem status report update for the Gulf of Mexico. NOAA Technical Memorandum NMFS-SEFSC-706, 51 p. National Oceanic and Atmospheric Administration and the National Marine Fisheries Service. Miami, Florida.
- Keeler, B. L., Chaplin-Kramer, R., Guerry, A. D., Addison, P. F., Bettigole, C., Burke, I. C., Gentry, B. *et al.* 2017. Society is ready for a new kind of science—is academia? *Bioscience*, 67: 591–592.
- Kemp, J., Jenkins, G. P., Smith, D. C., and Fulton, E. A. 2012. Measuring the performance of spatial management in marine protected areas. *Oceanography and Marine Biology: An Annual Review*, 50: 287–314.
- Kogan, F., Powell, A., and Fedorov, O. 2011. Use of satellite and in-situ data to improve sustainability. NATO Science for Peace and Security Series - C: Environmental Security. Springer, The Netherlands.
- Kujala, H., Burgman, M. A., and Moilanen, A. 2013. Treatment of uncertainty in conservation under climate change. *Conservation Letters*, 6: 73–85.
- Levin, P. S., Fogarty, M. J., Murawski, S. A., and Fluharty, D. 2009. Integrated ecosystem assessments: developing the scientific basis for ecosystem-based management of the ocean. *Plos Biology*, 7: 23.
- Lindstrom, E., Gunn, J., Fischer, A., McCurdy, A., Glover, L., Alverson, K., Bex, B. *et al.* 2012. A framework for ocean observing. Proceedings of the Ocean Information for Society: Sustaining the Benefits. Realizing the Potential, Venice, Italy, 21–25 pp.
- Link, J. S., Brodziak, J. K. T., Edwards, S. F., Overholtz, W. J., Mountain, D., Jossi, J. W., Smith, T. D. *et al.* 2002. Marine ecosystem assessment in a fisheries management context. *Canadian Journal of Fisheries and Aquatic Sciences*, 59: 1429–1440.
- Long, R. D., Charles, A., and Stephenson, R. L. 2015. Key principles of marine ecosystem-based management. *Marine Policy*, 57: 53–60.
- Marine Debris Tracker. 2017. Marine Debris Tracker. <http://www.marinedebris.engr.uga.edu/> (last accessed 28 February 2016).

- Marshall, N. A., Bohensky, E., Curnock, M., Goldberg, J., Gooch, M., Nicotra, B., Pert, P. *et al.* 2016. Advances in monitoring the human dimension of natural resource systems: an example from the Great Barrier Reef. *Environmental Research Letters*, 11: 114020.
- Mastrandrea, M. D., Field, C. B., Stocker, T. F., Edenhofer, O., Ebi, K. L., Frame, D. J., Held, H. *et al.* 2010. Guidance Note for Lead Authors of the IPCC Fifth Assessment Report on Consistent Treatment of Uncertainties. Intergovernmental Panel on Climate Change (IPCC).
- Maxwell, S. M., Hazen, E. L., Lewison, R. L., Dunn, D. C., Bailey, H., Bograd, S. J., Briscoe, D. K., *et al.* 2015. Dynamic ocean management: Defining and conceptualizing real-time management of the ocean. *Marine Policy*, 58: 42–50.
- McQuatters-Gollop, A. 2012. Challenges for implementing the Marine Strategy Framework Directive in a climate of macroecological change. *Philosophical Transactions of the Royal Society of London A: Mathematical, Physical and Engineering Sciences*, 370: 5636–5655.
- McQuatters-Gollop, A., Edwards, M., Helaouët, P., Johns, D. G., Owens, N. J. P., Raitsos, D. E., Schroeder, D. *et al.* 2015. The Continuous Plankton Recorder survey: How can long-term phytoplankton datasets contribute to the assessment of Good Environmental Status?. *Estuarine, Coastal and Shelf Science*, 162: 88–97.
- Melbourne-Thomas, J., Johnson, C. R., Fung, T., Seymour, R. M., Chérubin, L. M., Arias-González, J. E., and Fulton, E. A. 2011. Regional-scale scenario modeling for coral reefs: a decision support tool to inform management of a complex system. *Ecological Applications*, 21: 1380–1398.
- Meredith, M. P., Schofield, O., Newman, L., Urban, E., and Sparrow, M. 2013. The vision for a Southern Ocean Observing System. *Current Opinion in Environmental Sustainability*, 5: 306–313.
- Michaels, S. 2009. Matching knowledge brokering strategies to environmental policy problems and settings. *Environmental Science and Policy*, 12: 994–1011.
- Milner-Gulland, E. J., and Shea, K. 2017. Embracing uncertainty in applied ecology. *Journal of Applied Ecology*, 54: 2063–2068.
- Nichols, J. D., and Williams, B. K. 2006. Monitoring for conservation. *Trends in Ecology and Evolution*, 21: 668–673.
- OHI. 2017. The Ocean Health Index Annual Scores. <http://www.oceanhealthindex.org/region-scores/annual-scores-and-rankings> (last accessed 5 September 2017).
- OSPAR. 1992. OSPAR Convention for the Protection of the Marine Environment of the north-east Atlantic Oslo and Paris Commissions. OSPAR, London, UK.
- Pereira, H. M., Ferrier, S., Walters, M., Geller, G. N., Jongman, R. H. G., Scholes, R. J., Bruford, M. W. *et al.* 2013. Essential biodiversity variables. *Science*, 339: 277–278.
- PIFSC. 2016. West Hawai'i Integrated Ecosystem Assessment: Ecosystem Trends and Status Report. NOAA Fisheries Pacific Science Center, PIFSC Special Publication, SP-16-004, 47 p. doi: 10.2789/V5/SP-PIFSC-16-004. Pacific Islands Fisheries Science Center, Hawai'i.
- Pomeroy, R. S., Watson, L. M., Parks, J. E., and Cid, G. A. 2005. How is your MPA doing? A methodology for evaluating the management effectiveness of marine protected areas. *Ocean and Coastal Management*, 48: 485–502.
- Pörtner, H.-O., Karl, D. M., Boyd, P. W., Cheung, W. W. L., Lluich-Cota, S. E., Nojiri, Y., Schmidt, D. N., *et al.* 2014. Ocean systems. *In* *Climate Change 2014: Impacts, Adaptation, and Vulnerability. Part A: Global and Sectoral Aspects. Contribution of Working Group II to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change*, pp. 411–484. Ed. by C. B. Field, V. R. Barros, D.J. Dokken, K.J. Mach, M.D. Mastrandrea, T.E. Bilir, M. Chatterjee *et al.* Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA.
- Project Seagrass. 2017. Project seagrass. <http://www.projectseagrass.org/> (last accessed 28 February 2017).
- Queensland Audit Office. 2015. Managing Water Quality in Great Barrier Reef catchments. Queensland Audit Office, Brisbane.
- Regan, H. M., Colyvan, M., and Burgman, M. A. 2002. A taxonomy and treatment of uncertainty for ecology and conservation biology. *Ecological Applications* 12: 618–628.
- Secchi Disk. 2017. Secchi disk - The global seafarer study of the phytoplankton. <http://www.secchidisk.org/> (last accessed 28 February 2017).
- Seeley, B., Rapaport, J., Merritt, O., and Charlesworth, M. 2009. Guidance notes for the production of discovery metadata for the Marine Environmental Data and Information Network (MEDIN). <http://www.oceanet.org/> (last accessed 23 November 2017).
- Spiegelhalter, D. 2014. The future lies in uncertainty. *Science*, 345: 264–265.
- Stuart-Smith, R. D., Edgar, G. J., Barrett, N. S., Bates, A. E., Baker, S. C., Bax, N. J., Becerro, M. A. *et al.* 2017. Assessing national biodiversity trends for rocky and coral reefs through the integration of citizen science and scientific monitoring programs. *Bioscience* 67: 134–146.
- Tett, P., Gowen, R. J., Painting, S. J., Elliott, M., Forster, R., Mills, D. K., Bresnan, E. *et al.* 2013. Framework for understanding marine ecosystem health. *Marine Ecology Progress Series*, 494: 1–27.
- Thébaud, O., Link, J. S., Kohler, B., Kraan, M., López, R., Poos, J. J., Schmidt, J. O. *et al.* 2017. Managing marine socio-ecological systems: picturing the future. *ICES Journal of Marine Science*, 74: 1965–1980.
- Tittensor, D. P., Eddy, T. D., Lotze, H. K., Galbraith, E. D., Cheung, W., Barange, M., Blanchard, J. L. *et al.* 2017. A protocol for the intercomparison of marine fishery and ecosystem models: Fish-MIP v1.0. Geoscientific Model Development Discussion: doi: 10.5194/gmd-2017-5209.
- United Nations. 2016. The First Global Integrated Marine Assessment World Ocean Assessment I. www.un.org/Depts/los/woa (last accessed 23 November 2017).
- USC. 2002. Federal Water Pollution Control Act (33 U.S.C. 1251 et seq.). United States Congress.
- USEPA. 2015. Water quality standards and the water quality-based approach to pollution control. *In* *Water Quality Standards Handbook*. Ed. by United States Environmental Protection Agency. <https://www.epa.gov/wqs-tech/water-quality-standards-handbook> (last accessed 25 November 2017).
- Vann-Sander, S., Clifton, J., and Harvey, E. 2016. Can citizen science work? Perceptions of the role and utility of citizen science in a marine policy and management context. *Marine Policy*, 72: 82–93.
- Vitolo, C., Elkhatib, Y., Reusser, D., Macleod, C. J., and Buytaert, W. 2015. Web technologies for environmental Big Data. *Environmental Modelling and Software*, 63: 185–198.
- Wallis, J. C., Rolando, E., and Borgman, C. L. 2013. If we share data, will anyone use them? Data sharing and reuse in the long tail of science and technology. *PLoS ONE*, 8: e67332.
- Weijerman, M., Fulton, E. A., Janssen, A. B. G., Kuiper, J. J., Leemans, R., Robson, B. J., van de Leemput, I. A. *et al.* 2015. How models can support ecosystem-based management of coral reefs. *Progress in Oceanography*, 138: 559–570.

Handling editor: Robert Blasiak