



Ideas and perspectives: Biogeochemistry - Its Future Role in Interdisciplinary Frontiers

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Abstract. Biogeochemistry has an important role to play in many environmental issues of current concern related to global change and air, water, and soil quality. However, reliable predictions and tangible take-up of solutions offered by biogeochemistry will need further integration of disciplines. Here, we emphasize how further developing ties between biology, geology, and chemistry and social sciences will advance biogeochemistry through: 1) better integration of mechanisms

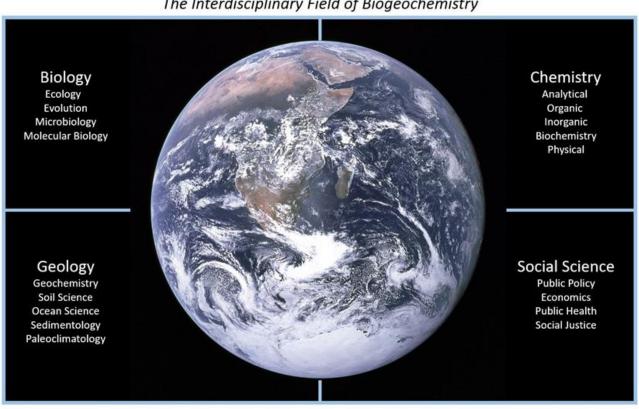
- 25 including contemporary evolutionary adaptation to predict changing biogeochemical cycles; 2) better integration of data from long-term monitoring sites in terrestrial, aquatic, and human systems across temporal and spatial scales, including the continental and global scale, for use in modeling efforts; and 3) implementing insights from social sciences to better understand how sustainable and equitable responses by society are achieved. The challenges of 21st century biogeochemists are formidable, and will require both the capacity to respond fast to pressing issues and intense collaboration with government
- 30 officials, the public, and internationally-funded programs. Keys to its success will be the degree to which biogeochemistry succeeds in making biogeochemical knowledge more available to policy makers and educators, in predicting future changes in the biosphere in response to climate change and other anthropogenic impacts on time scales from seasons to centuries, and in facilitating sustainable and equitable responses by society.





1 Introduction

40 Biogeochemistry was one of the first truly inter- or multi-disciplinary sciences (Bianchi 2020, Gorham 1991, Schlesinger 1991, Vernadsky et al. 1926) and the field is now expanding in multiple directions: from small scales via interactions with microbiology and 'omics approaches (genomics, transcriptomics, proteomics, and metabolomics) (Figure 1) to large scales as a component of Earth System Sciences (Steffen et al. 2020).



The Interdisciplinary Field of Biogeochemistry

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Figure 1: The 21st century now demands new interdisciplinary approaches that involves the integration of the disciplines core to traditional biogeochemistry with social sciences.

A more recent review of Biogeochemistry incudes some of these more nascent linages molecular biology (Bianchi 2020). 50 Biogeochemists will be challenged to better link Earth System Models and biogeochemical cycling with biological trait change and environmental modeling. A better incorporation of mechanistic knowledge from "omic" studies (Coles et al. 2017) and a stronger integration of ecological and evolutionary dynamics will allow more reliable predictions of ecological and





evolutionary responses to global change (Urban et al. 2016). In this perspective, we emphasize how further developing ties between biology, geology, and chemistry and also with social sciences will advance biogeochemistry through a better integration of: 1) mechanistic insights at multiple levels of biological organization, including the dynamic interactions between

55 integration of: 1) mechanistic insights at multiple levels of biological organization, including the dynamic interactions between contemporary evolution and ecology to predict changing biogeochemical cycles, 2) data from long-term monitoring sites in terrestrial, aquatic, and human systems across temporal and spatial scales, including the continental and global scale, for use in modeling efforts, and 3) insights of social sciences, focusing on the human-natural system as a whole.

60 2 Understanding Biogeochemistry using 'Omics

In recent decades, the ability to directly track genes and gene functions of organisms in nature, especially in microbes, has greatly contributed to understanding their interactions with biogeochemical cycles (Martiny et al. 2006, Rusch et al. 2010). Measurements of microbial transcripts and proteins in natural environments has allowed direct observation of the cellular functions as adaptive responses to the environment (Bergauer et al. 2018, Gifford et al. 2011). These functional systems include

- 65 biogeochemically-relevant enzymes, transporters, storage molecules, and regulatory systems, and the quantitation of enzymes can be used to generate 'omic-based potential biogeochemical rates (Saito et al. 2020). This provides mechanistic information about the underpinnings of biological controls on biogeochemistry and allows direct quantification of rate changes along different pathways. There are many knowledge gaps to fill, however: roughly half of all genes have unknown function, the systems biology controlling regulation is poorly characterized (Held et al. 2019), and we know little about how the different
- 50 biochemical pathways relate to resilience at the ecosystem level. Forging connections between the genetic and biochemical underpinnings to the production of metabolites that contribute to carbon and other element cycling is primed for discovery (Soule et al. 2015). Omics studies will also help understanding how the microbiomes of plants, invertebrates and vertebrates making up the predator-prey and decomposition food webs influence biogeochemical cycles (Macke et al. 2017).

75 3 Linking Ecological and Evolutionary dynamics

There has been longstanding interest in the co-evolution of life and biogeochemical cycles on Earth, as chemical conditions of this planet have been strongly influenced by the evolving biochemical capabilities of life (Canfield et al. 2007, Lenton et al. 2014, Saito et al. 2003). Earth's life support system is inextricably tied to biogeochemical cycling and evolution. Recently, evidence has accumulated that significant evolutionary trait change can occur over time scales of just a few generations, and

80 the rapidly changing environmental context at local, regional and global scales during the Anthropocene leads to strong selection pressures on populations to adapt (Bell et al. 2008; Hutchins et al. 2015; Kuebbing et al. 2018, Seibel and Deutsch 2020). This contemporary evolution has been shown to impact ecosystem functioning and elemental cycling dynamics (Bassar et al. 2010, Declerck et al. 2015). In one example, evolution of zooplankton within a single growth season has been shown to



biogeochemical cycles.



shape the typical seasonal dynamics of phyto- and zooplankton in lakes (Schaffner et al. 2019). In another example, evolution
in body size in salmon through its effects on salmon consumption by bears affects nutrient transfer from aquatic to terrestrial
systems (Carlson et al. 2011). Many surprising pathways and mechanisms are to be discovered. For example, fear of predation
by spiders can alter the elemental composition of grasshoppers, resulting in changes in production and nutrient cycles in
ecosystems (Hawlena et al. 2012). Theory indicates that rapid evolutionary trait change can also influence the occurrence and
(recovery) trajectory of ecosystem regime shifts (Dakos et al. 2019). Integrating ecological and evolutionary responses is
needed to make reliable predictions of how ecosystems respond to climate change (Matthews et al. 2011) and how this impacts

Biogeochemistry should treat ecosystems and their biota as complex adaptive integrative systems, including population-level genetic adaptation to environmental change (Levin 2003). Due to their short generation times, eco-evolutionary dynamics are expected to be important in microbial communities that are key to determining rates and types of biogeochemical processes

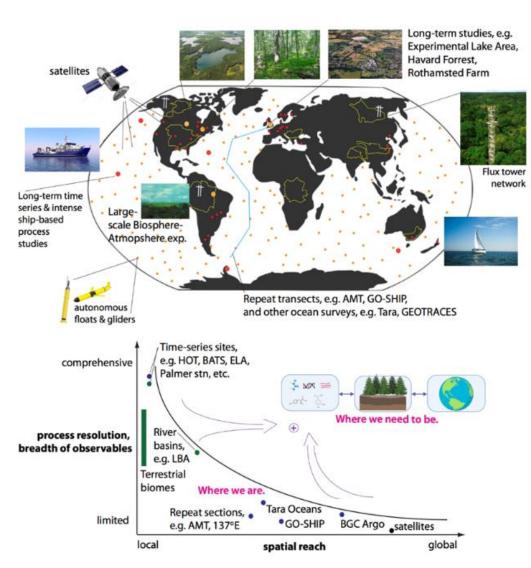
95 (Reed et al. 2014). While the above examples illustrate that short-term evolutionary processes can influence how populations and communities influence biogeochemical cycles on a timescale of years or less, the evolutionary emergence of enzymes with new biogeochemical functionality appears to be rarer, occurring over geologic time scales (David and Alm 2011).

4 A Renewed Holistic Approach in Earth Sciences

Increased understanding of how eco-evolutionary and ecophysiological responses regulate biogeochemical cycling under global change must be matched by an ability to detect the biogeochemical changes and feedbacks on regional to global scales. Therefore, the ability to monitor key biogeochemical parameters and processes across the globe is of fundamental importance, but a formidable challenge (Figure 2).







105 Figure 2: Illustration of the current trade-off between geographic scope and mechanistic depths and detail of observables in marine, inland water and terrestrial environmental studies. The upper panel indicates selected examples ranging from long-term time series to global programs. The lower panel schematically illustrates the hurdle to achieving comprehensive global understanding that has to be overcome by integrating local, regional and global scale programs.

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Presently, programs integrating microbial communities with their functional environmental impacts are local or regional in geographic scope (Richter et al. 2018). Examples are two programs focused on oceanographic regions (the Hawaii Ocean Time-series [HOT], the Bermuda Atlantic Time-series [BATS]) and a program with a national focus (the U.S. National





- 115 Ecological Observatory Network [NEON]). Similarly, molecular-level approaches are most often focused on specific sites (Crowther et al. 2019, Simpson and Simpson 2012). Programs with global reach tend to be limited in their observables and their ability to achieve detailed process resolution. Some of these programs are satellite-based, but also include experiment and modeling networks (Djukic 2018, Stokstad 2011). Some examples include LANDSAT, the Gravity Recovery and Climate Experiment [GRACE] and the Soil Moisture Active Passive [SMAP] missions, and global networks of autonomous ocean
- 120 profilers (Chai et al. 2020). Both local/regional and global-scale approaches are essential to achieve a comprehensive and global view of how our planet works and how and why our planet's environment is changing. Global geochemical and genomic ocean survey efforts are underway (e.g., GEOTRACES and Tara Ocean), however efforts to thoroughly integrate these approached have been more limited. The international interest in creating a global scale marine microbial biogeochemistry effort, currently called Biogeoscapes, is in line with such needed integrative approaches, and could serve as an important
- 125 example of an integrative global mechanistic study. Finally, improved flow of information between increasing observational capacity (including both technical capabilities and numbers of study sites) and global modeling efforts will be needed.

To detect and mitigate global environmental change, a mechanistic understanding linking molecular-level data (biological, chemical, and geological) to processes occurring at the scale of entire biomes or the globe needs to be achieved (Crowther et

- 130 al. 2019). This is a major challenge as it requires connecting cellular and organismal level systems biology with observational and modeling studies of global biogeochemical cycles. Synergies between detailed process-level understanding through local or regional studies and the ability to upscale and detect global change through global-scale observations have already contributed strongly to progress in our field, progressing beyond some its previously conceived shortfalls (Cutter 2005, Likens 2004). Yet, more improvements are needed (Groffman et al. 2017), amongst others to face the challenges of accessibility and
- 135 sharing of complex data (Saito et al. 2020, Tanhua et al. 2019, Villar et al. 2018), the integration of observations and predictive models (Fennel et al. 2019), and the incorporation of societal factors (e.g., damming, nutrient management) in model projections (Seitzinger et al. 2010).

5. Embracing the Social Dimension

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Vernadsky's popularization of a planet-wide "biosphere" defined by the modifying influences of life, and his later expansion of this concept into the "noösphere" defined by human influence, presaged modern Sustainability Science -- "an emerging field of research dealing with the interactions between natural and social systems, and with how those interactions affect the challenge of sustainability" (Kates 2011). Nearly a century after Vernadsky, biogeochemistry is, once again, poised for a burst

145 of even greater interdisciplinary progress and impact, especially if biogeochemists build bridges with the social sciences and propose solutions that recognize Sustainability Science's "triple bottom line" of environment, economics, and equity.



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We argue for a new pathway in biogeochemistry that considers the many dimensions of sustainability throughout the research process, and considers biogeosciences and the social sciences as contributing to a holistic understanding of the human-environment system (Figure 3).

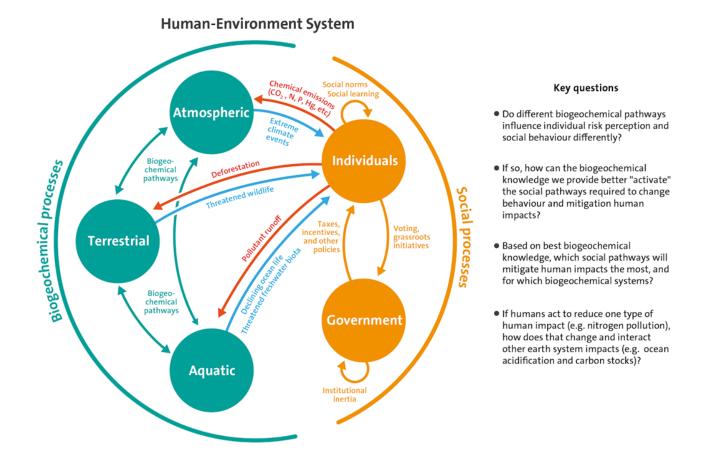


Figure 3: "Translational biogeochemistry" would encompass the two-way feedbacks between human and biogeochemical systems. Understanding human societal pathways will be critical in discerning and mitigating future climate patterns and its biogeochemical consequences.

This is similar to the idea of translational medicine, an interdisciplinary area of research that aims to improve human health by focusing on the relevance of novel research discoveries to actual patient outcomes. We argue that there is a large gap between

160 discoveries in biogeochemistry and their application to improving ecosystem health. For example, biogeochemistry research may present many possible solutions to managing the global carbon budget -- from planting a trillion trees, to carbon taxes





and trading, to direct air carbon capture -- but their adoption (or not) by various levels of society are not generally studied scientifically, which could very much hamper the development of solutions.

- 165 Integrating human behaviour at several scales is essential because a lack of understanding of social processes can lead to unexpected societal "push back", rendering scientific advances less impactful. For example, the "yellow vest" protests in France emerged in response to a new carbon tax and greatly hindered progress toward carbon management goals in that country. Protestors agreed that climate change is an issue but were not willing to accept socially unjust solutions. While top-down approaches like the Paris agreement, with its ongoing political challenges and limited efficacy in combating climate remains a major issue, scientists are rushing to study how to harness social forces in a polycentric manner in order to tackle global-scale sustainability challenges. Put succinctly, without involving individuals outside of the field in all stages of the research process, biogeochemistry research that seeks to advance sustainability through policy or behaviour change risks answering questions that decision-makers are not asking, or proposing solutions that populations will not adopt. The window of opportunity to protect many of the natural systems we have the privilege of studying is rapidly disappearing. And the primary barrier to adoption of many sustainability solutions are often political and social limitations, not lack of scientific
- knowledge or availability of technology. Increasing public awareness of how basic science is linked with environmental problems through early education will be key in reducing these limitations.
- Does the need for socially conscious, policy-driven research mean that basic science inquiry in biogeochemistry is dead? Are we not allowed to wonder about the origin of the earth and the basic processes that underlie the cycling of energy, water and nutrients across the surface of the earth? We argue that there is a false dichotomy between biogeochemistry and a translational bio-geo-socio-chemistry. Indeed, our goals are consistent with Vernadsky's original vision, as he stated "understanding our planet the way it is." The difference is that human influence on the Earth system is now so pervasive that our challenge has moved from integration of biology, geology and chemistry, to inclusion of social sciences. Indeed, this will make biogeochemical knowledge more available to policy makers and educators; help predict future changes in the biosphere in response to climate change and other anthropogenic impacts on time scales from seasons to centuries; and facilitate sustainable and equitable responses by society. Nevertheless, our knowledge of biogeochemical cycles remains relatively limited compared to other core sciences (biology, chemistry, physics, geology) and thus basic research will be key in understanding and laying the foundation for good policy development.

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Biogeochemistry is already an inherent component of Sustainability and Earth System Sciences, which are addressing the overarching challenge of how global change impacts the habitability of our planet and our ability to sustainably use its resources to feed and supply the world population and economy. A pivotal issue is how organismal, environmental, and societal processes cause feedbacks that affect biogeochemical cycles and global change (Seitzinger et al. 2010). A "translational" biogeochemistry would be a natural pathway of research on transformational human-environment processes





because (1) both sustainability science and biogeochemistry are systems science approaches, and (2) collaboration between biogeochemists and social scientists could address topical key questions at a scale that is both holistic with respect to socialclimate interactions, and suitably fine-grained (Figure 3). A holistic human-environment systems approach to applied biogeochemistry that accounts for social feedback might help winnow down policy recommendations to those that are both effective and likely to be adopted.

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Key questions include: Do different biogeochemical systems pathways (e.g. extreme climate events versus ocean acidification) influence risk perception and social behaviour differently (e.g. GHG emission reduction versus dietary change)? If so, how can the biogeochemical knowledge we provide better "activate" the social pathways required to support mitigation behaviour? And, how will feedbacks between different biogeochemical systems hinder or accelerate these social pathways? An example of such an integrative approach is coupled social-climate modelling (Bury et al 2019), in which submodels are developed both for social dynamics and climate dynamics, and the two submodels are then coupled together. As a result of this, socio-economic pathways become a prediction of theoretical models and thus become the subject of scientific study themselves, instead of being assumptions that are simply input into climate models. A human-environment perspective would change not only how we think about the natural world, but how we design our research. A sustainability science approach to

6 Summary and Recommendations

The regional and global importance of biogeochemical processes for the homeostasis of Earth's life support system necessitates accelerating research to achieve the goal of a sustainable global society. Starting from an awareness of the field's history, new developments and key limitations of current approaches, we aimed at developing a perspective on how biogeochemistry can better serve society.

research may include stakeholders and policy experts at all stages in the research process.

The challenges and opportunities of 21st century biogeochemists are formidable and will require intense collaboration with government officials, the public, internationally-funded programs, and other fields such as the social sciences. Keys to its success will be the degree to which biogeochemistry succeeds in making biogeochemical knowledge more available to policy

- 220 makers and educators, in predicting future changes in the biosphere in response to climate change and other anthropogenic impacts on time scales from seasons to centuries, and in facilitating sustainable and equitable responses by society. While Biogeochemistry remains a young field, it will have an important role in bringing about a sustainable future. There are several impediments to fully realizing this role, including the need for further integration across disciplines and spatial scales, the intrinsic challenges of combining increased breadth with mechanistic depth, and the need to strengthen connections to society.
- 225 While biogeochemistry has made major achievements in the past century describing Earth's global and regional biogeochemical cycles for the first time, we recognize that the field has acquired new societal responsibilities, in particular





uncovering how humans are rapidly changing biogeochemical cycles, assessing the impact of these changes on biological communities and feedbacks on society, and effectively communicating this information to policy makers and society-at-large.

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