

Linking evolutionary and ecological theory illuminates non-equilibrium biodiversity

Abstract

Whether or not biodiversity dynamics tend toward stable equilibria remains an unsolved question in ecology and evolution with important implications for our understanding of diversity and its conservation. Phylo/population genetic models and macroecological theory represent two primary lenses through which we view biodiversity. While phylo/population genetics provide an averaged view of changes in demography and diversity over timescales of generations to geological epochs, macroecology provides an ahistorical description of commonness and rarity across contemporary co-occurring species. Our goal is leverage advances in community-wide high throughput sequencing technology, specifically metabarcoding, to combine evolutionary and macroecological approaches to gain novel insights into the non-equilibrium nature of biodiversity. We help guide near future research with a call for bioinformatic advances and an outline of quantitative predictions made possible by our approach.

Non-equilibrium, inference, and theory in ecology and evolution

The idea of an ecological and evolutionary equilibrium has pervaded studies of biodiversity from geological to ecological, and from global to local (Sepkoski 1984; Chesson 2000; Hubbell 2001; Tilman 2004; Rabosky 2009; Harte 2011). The consequences of non-equilibrium dynamics for biodiversity are not well understood and the need to understand them is critical with anthropogenic pressures forcing biodiversity into states of rapid transition (Blonder *et al.* 2015). Non-equilibrial processes could profoundly inform conservation in ways only just beginning to be explored (Wallington *et al.* 2005).

Biodiversity theories based on assumptions of equilibrium, both mechanistic (Chesson 2000; Hubbell 2001; Tilman 2004) and statistical (**see the Glossary**) (Pueyo *et al.* 2007; Harte 2011) have found success in predicting ahistorical patterns of diversity such as the species abundance distribution (Hubbell 2001; Harte 2011; White *et al.* 2012) and the species area relationship (Hubbell 2001; Harte 2011). These theories assume a macroscopic equilibrium in terms of these coarse-grained metrics, as opposed to focusing on details of species identity (such as in Blonder *et al.* (2015)), although macroscopic and microscopic approaches are not mutually exclusive. Nonetheless, the equilibrium assumed by these theories is not realistic (Ricklefs 2006), and many processes, equilibrial or otherwise, can generate the same macroscopic, ahistorical predictions (McGill *et al.* 2007).

Tests of equilibrial ecological theory alone will not allow us to identify systems out of equilibrium, nor permit us to pinpoint the mechanistic causes of any non-equilibrial processes. The dynamic natures of evolutionary innovation and landscape change suggest that ecological theory could be greatly enriched by synthesizing its insights with inference from population genetic theory that explicitly accounts for history. This would remedy two shortfalls of equilibrial theory: 1) if theory fits observed ahistorical patterns but the implicit dynamical assumptions were wrong, we would make the wrong conclusion about the equilibrium of the system; 2) if theories do not fit the data we cannot know why unless we have a perspective on the temporal dynamics underlying those data.

No efforts to date have tackled these challenges. We propose that combining insights from ecological theory and inference of evolutionary and demographic change from genetic data will allow us to understand and

predict the consequences of non-equilibrium processes in governing the current and future states of ecological assemblages. The advent of high throughput sequencing-enabled metabarcoding has made unprecedented data available about the biodiversity of lineages from microbes to arthropods (Taberlet *et al.* 2012; Ji *et al.* 2013; Zhou *et al.* 2013; Bohmann *et al.* 2014; Gibson *et al.* 2014; Dodsworth 2015; Leray & Knowlton 2015; Linard *et al.* 2015; Shokralla *et al.* 2015; Venkataraman *et al.* 2015; Liu *et al.* 2016). These metabarcoding data have great potential to yield synthetic insight across ecology and evolution. However, to draw such insights we need a new tool set of bioinformatic methods (**Box box:dry**) and meaningful predictions (**section ref sec:pred**) grounded in theory to make use of those data. We present the foundation of this methodological tool set here.

Ecological theories and non-equilibrium

Neutral and statistical theories in ecology focus on macroscopic patterns, and equilibrium is presumed to be relevant to those patterns. Our goal throughout is not to validate neutral or statistical theories—quite the opposite, we propose new data dimensions, namely genetics, to help better test alternative hypotheses against these null theories, thereby gaining insight into what non-neutral and non-statistical mechanisms are at play in systems of interest.

Non-neutral and non-statistical models (e.g., Tilman (2004); Chesson (2000)) also invoke ideas of equilibrium in their derivation. However, these equilibria focus on the micro-scale details of species interactions, which could in fact lead to instability and non-equilibrium at larger scales (cite: romGEB, critical transition in food web stuff from Beth, random matrix theory). Thus, detailed species interactions could in fact be drivers of non-equilibrium and thus interesting hypotheses to test as alternatives to neutral/statistical models.

To use neutral/statistical theories as null models, we need a robust measure of goodness of fit. The emerging consensus is that likelihood-based test statistics should be preferred (Baldrige *et al.* 2016). The “exact test” of Etienne (2007) has been extended by Rominger & Merow (2017) into a simple z-score which can parsimoniously describe the goodness of fit between theory and pattern. We advocate its use in our proposed framework.

The unified neutral theory of biodiversity (UNTB) (Hubbell 2001) is a useful null because it assumes that one mechanism—demographic drift—drives community assembly. Equilibrium occurs when homogeneous stochastic processes of birth, death, speciation and immigration have reached stationarity. Thus neutrality in ecology is analogous to neutral drift in population genetics (Hubbell 2001) (also cite molecular neutral theory).

Rather than assuming any one mechanism dominates the assembly of populations into a community, statistical theories assume all mechanisms could be valid, but their unique influences have been lost to the enormity of the system and thus the outcome of assembly is a community in statistical equilibrium [Harte (2011); pueyo2007]. The mechanistic agnosticism is what makes statistical theories useful nulls. These statistical theories are also consistent with niche-based equilibria (Pueyo *et al.* 2007; Neill *et al.* 2009) if the complicated, individual or population level models with many mechanistic drivers were to be upscaled to entire communities.

The maximum entropy theory of ecology (METE) (Harte 2011) derives its predictions by condensing the many bits of mechanistic information down into ecological state variables and then mathematically maximizing information entropy conditional on those state variables. METE can predict multiple ahistorical patterns, including distributions of species abundance, body size, spatial aggregation, and trophic links (Harte 2011; Rominger *et al.* 2015; Rominger & Merow 2017), making for a stronger null theory (McGill 2003). However, multiple dynamics can still map to this handful of metrics (McGill *et al.* 2007) and while extensive testing often supports METE’s predictions [Harte (2011); white2012; xiao2015] at single snapshots in time, METE fails to match observed patterns in disturbed and rapidly evolving communities [Rominger *et al.* (2015); harte2011]. Just like deviations from UNTB, we cannot know the cause of these departures from theoretical predictions without adding tests of theories and metrics that capture temporal dynamics.

87 Inferring non-equilibrium dynamics

88 Unlocking insight into the dynamics underlying community assembly is key to overcoming the limitations of
89 analyzing ahistorical patterns with equilibrium theory. While the fossil record could be used for this task, it
90 has limited temporal, spatial, and taxonomic resolution. Here we instead focus on population/phylogenetic
91 insights into rates of change of populations and species because while there are real limitations in the accuracy
92 and resolution of temporal dynamics with population genetic (cite) and phylogenetic (cite) methods, they can,
93 in principle, be applied to any extant group. Additionally, despite limitations in resolving detailed temporal
94 dynamics, robust metrics of deviation from simple, stationary birth-death and/or speciation-extinction
95 processes have been well-established and widely used for population genetic and phylogenetic data (cite about
96 Tajima D, gamma stats, etc).

97 Current efforts to integrate evolution into ecological theory

98 While quantitatively integrating theory from ecology, population genetics, and phylogenetics has not yet
99 been achieved, existing efforts to synthesize perspectives from evolution and ecology point toward promising
100 directions despite being hindered by one or more general issues: 1) lack of a solid theoretical foundation, 2)
101 inability to distinguish multiple competing alternative hypotheses, 3) lack of comprehensive genetic/genomic
102 data, and 4) lack of bioinformatic approaches to resolve species and their abundances with high throughput
103 sequencing data.

104 Phylogenetic information has been incorporated into studies of the UNTB to better understand its ultimate
105 equilibrium (Jabot & Chave 2009; Burbrink *et al.* 2015). However, phylogenetic reasoning also points out the
106 flaws in the UNTB's presumed equilibrium (Ricklefs 2006). Attempts to correct the assumed dynamics of
107 UNTB through "protracted speciation" (Rosindell *et al.* 2010) are promising, and while their implications for
108 diversification have been considered (Etienne & Rosindell 2011), these predictions have not been integrated
109 with demographic and phylogeographic approaches (e.g., (Edwards & Beerli 2000; Charlesworth 2010; Prado-
110 Martinez *et al.* 2013)) that have the potential to validate or falsify presumed mechanisms of lineage divergence.
111 Such demographic studies, particularly phylogeographic investigations of past climate change, have highlighted
112 the non-equilibrium responses of specific groups to perturbations (Hickerson & Cunningham 2005; Smith *et*
113 *al.* 2012), but no attempt has been made to scale up these observations to implications at the level of entire
114 communities. The recent growth in joint studies of genetic and species diversity (Vellend 2005; Papadopoulos
115 *et al.* 2011) have been useful in linking population genetics with ecological and biogeographic concepts.

116 Studies have also used chronosequences or the fossil record in combination with neutral and/or statistical
117 theory to investigate changes over geologic time in community assembly mechanisms (Wagner *et al.* 2006;
118 Rominger *et al.* 2015). While these studies have documented interesting shifts in assembly mechanisms,
119 including departures from equilibrium likely resulting from evolutionary innovations, understanding exactly
120 how the evolution of innovation is responsible for these departures cannot be achieved without more concerted
121 integration with insights from evolutionary theory.

122 Data and Code Availability

123 All data and code needed to reproduce the results of this manuscript are available at <https://github.com/ajrominger/EcoEvoNonStat> and a detailed description of the analytical approach is available in the supplement.
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