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Adaptation to the abiotic environment in insects: the influence of variability on ecophysiology and evolutionary genomics

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Advances in tools to gather environmental, phenotypic, and molecular data have accelerated our ability to detect abiotic drivers of variation across the genome-to-phenome spectrum in model and non-model insects. However, differences in the spatial and temporal resolution of these data sets may create gaps in our understanding of linkages between environment, genotype, and phenotype that yield missed or misleading results about adaptive variation. In this review we highlight sources of variability that might impact studies of phenotypic and 'omic environmental adaptation, challenges to collecting data at relevant scales, and possible solutions that link intensive fine-scale reductionist studies of mechanisms to large-scale biogeographic patterns.

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Introduction

"It is simpler to examine most biological phenomena in uniform or invariable environments than under variable conditions" – Beardmore and Levine [1]

Methodological advances have greatly aided the quest to link genotype to phenotype in diverse organisms, providing new tools for addressing major questions in ecology and evolution [2,3]. High-throughput DNA sequencing has enabled rapid determination of individual genotypes at genome-wide resolution [4–6], facilitating comparisons

among individuals, populations, and species. Linking genotypes with relevant phenotypes is a powerful approach for inferring adaptation of insects to the abiotic environment [7]. However, the abiotic environment, insect phenotypes, and the 'omics that determine those phenotypes are often far more variable in time and space than commonly appreciated, complicating inferences of adaptation. A better understanding of variation at all of these levels will be crucial to deciphering how organisms adapt to the abiotic environment.

Insects experience some degree of spatial and temporal environmental variation whether they have broad or restricted distributions [8–10]. Such variation includes large-scale bioclimatic gradients for species with broad geographic ranges, such as temperature changes with latitude or elevation [11], small-scale local extremes for species that occupy multiple microhabitats during a day [12**], or seasonal extremes for long-lived or multivoltine species [13]. Individuals or populations must thus express physiological traits emerging from underlying 'omic variation (e.g. genomic, transcriptomic, proteomic, metabolomic) that facilitate tolerance of variation over space and time [14].

However, an explicit appreciation for variation in abiotic environments, in phenotypes necessary to live in those environments, and in the genetic basis of those phenotypes is rare in the literature. Abiotic variables like temperature are rarely measured at spatial and temporal scales relevant to insects [8,10]. Phenotypes are generally measured for a small number of individuals from a few populations of relatively few species, and, for many species, it may not even be clear what phenotypes are most important to measure. The ability to characterize molecular variation from large numbers of individuals sampled across abiotic gradients has provided many examples of genes that facilitate abiotic adaptation [15°,16°,17°,18°]; however, analytical challenges (such as multiple, co-occurring population genetic processes) and a lack of high resolution environmental data mean we may often be missing much of the picture. Methodological issues can be overcome, but conceptual advances will also be necessary to better account for variation (at all these levels) in studies of insect adaptation to the abiotic environment. Understanding ecological and evolutionary responses to abiotic variation across relevant spatial and temporal scales will improve our capacity to predict how species will respond to local and global environmental change [19–21].

In this review we discuss how abiotic variability may influence variation in phenotypes and genotypes, and how integration of experimental physiology and genomic approaches can yield novel insights into environmental adaptation. We focus on temperature because it has been best studied from characterization of environments (including microclimates) to phenotypic and genotypic responses. Other abiotic variables, including precipitation [22], oxygen [23], wind speed, solar radiation, acidity, and salinity, or anthropogenic stressors like pesticides [24°] or urbanization [25], may similarly create fine-grained landscapes of stress to which insects must respond, and the principles discussed here should largely apply to studies of these other factors.

Variation in the abiotic environment at the insect scale

Variation in phenotypes across individuals, populations, and species reflects, to a large extent, tolerance to abiotic conditions, which vary geographically [26]. It is only recently becoming clear that variation per se may be more important than mean conditions in determining organisms responses to climate [19,27,28] and that organisms respond to variation at much finer temporal and spatial scales (seconds to hours and mm to meters) than those typically considered (monthly to annual and km to continents) [12**,29]. Despite this growing appreciation of how fine scale variation can determine traits critical for population persistence [8,9,21,27,30], characterizing spatial and temporal variation in abiotic variables and incorporating those key elements of variation in studies of adaptation remains a hurdle (but see Refs. [31,32,33**]).

The capacity to gather and analyze data at fine temporal and spatial scales currently limits mapping of temperatures at insect scales [8,10,34]. Although countless studies have likely measured, for example, field temperatures at high temporal frequencies (1/s), that temporal variation is usually lost in statistical summaries in publications [10,35], leaving few data sets with temperatures measured at high temporal frequency and with broad geographic coverage (but see Refs. [34,36,37]). Fortunately, the recent development of low-cost thermal imaging will facilitate characterization of temperature variation over spatial scales relevant to insects [38,39].

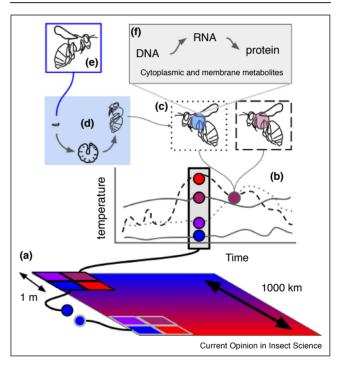
Insect body temperatures are determined by complex interactions between biophysical characteristics and behavior and a mosaic of ambient conditions that dictate heat (or moisture or respiratory gas) transfer between the environment and the organism. New approaches for predicting landscapes of insect body temperatures from mechanistic biophysical models [40,41] and organismal climatology [42], combined with methods for extracting important metrics of variation [31,43-45], will facilitate more insect-centric characterization and manipulation of abiotic variables. These approaches have rarely been applied in evolutionary 'omics studies (but see e.g.

[46]) and require continued refinement to make them broadly available [47]. A key challenge will be identifying the habitats and spatial scales over which variation is predictable [43,48], as continuous measurement of all sites at high frequency and at relevant scales is currently impractical. Characterization of abiotic stressors at the appropriate spatial and temporal scales not only provides a more accurate picture of what insects are adapting to, but also directly informs measurements of physiological traits of insects living in those environments (Figure 1).

Insect physiological responses to environmental variation

Mounting evidence suggests that fine-scale variation in temperature (and likely other abiotic factors: precipitation

Figure 1



Spatial and temporal variation in abiotic stressors challenges characterization of environments, of insect phenotypes, and therefore of inference of abiotic adaptation. (a) Within a square meter, an insect could experience as much temperature variation as is found across 1000 km [39]. Therefore, insects from warm (red) climates (gray border squares) may rely on cooler (blue) microclimates to maintain similar body temperatures (gray outlined point) as insects from cool climates (black outlined point). (b) Even after sampling across habitats, current temperatures (gray box) may not reflect past temperatures or predict future conditions. Insects sampled from apparently similar thermal environments (magenta points) could have strikingly different thermal histories, resulting in differences in thermal traits. (c) The enhanced heat tolerance of the insect on the right could reflect previous exposure to hot temperatures (dashed line), and the enhanced cold tolerance of the insect on the left could reflect previous cold exposure as an adult (dotted line), or during development (d), or (e) thermal experience of its parents. (f) Ultimately, these physiological differences arise from cellular level differences in genotype, in transcribed RNA and proteins, and in interacting metabolites, all of which can be measured with 'omics approaches.

[22], oxygen [23]) often drives insect physiological responses [9,12**,49,50], calling into question the standard approach of characterizing physiology via 'thermal performance curves' (TPCs) based on static temperature treatments [27,51–53]. A single TPC is likely insufficient to characterize responses of insect species or populations because insects rarely experience constant temperatures but rather have adapted to the temporal and spatial variations in body temperatures (including extremes) experienced in their lifetimes [54,55]. For example, in the case of heat tolerance, both the shapes of TPCs and the optimal temperatures for performance depend more strongly on temperature variation, than on mean temperature [53,56].

Over shorter timescales, TPCs of individual insects can vary due to recent temperatures experienced during a heat/cold shock [57], diurnal cycles [58], a heat or cold front [59], or temperatures experienced in previous life stages (developmental plasticity, e.g. [60]) or by the parent (transgenerational or epigenetic, e.g. [61]) (Figure 1). Physiological traits can also vary over short spatial scales. For example, ants and bees in urban environments tolerate higher temperatures than those in nearby rural areas [62,63] and canopy ants are more heat tolerant than those on the forest floor [64]. Even at the level of individual leaves, insects can differ in upper lethal temperature by up to 8°C, despite separation of only a few centimeters [12**]. It will be critical to incorporate these thermal history effects into estimates of the physiological responses of insects to environmental temperatures [51,53,65] if we are to appropriately characterize phenotypes and their adaptive variation in response to abiotic stressors.

Broadly speaking, these differences reflect responses to thermal history via trait plasticity at different time scales. The extent to which physiological traits are plastic, whether trait plasticity varies consistently across geographic gradients, and whether plasticity itself evolves to facilitate persistence in the face of abiotic stressors are all critical questions that have engaged physiologists for decades [66-68]. Environmental variation itself can also drive both plasticity and its evolvability [69]. For example, in ants, both thermal tolerance and plasticity of thermal tolerance evolve rapidly in response to urban heat clines [70]. However, plasticity can vary strikingly between traits [71], insects may tradeoff constitutive (local adaptation) and induced tolerance (plasticity), and traits may evolve together [72] or be uncorrelated [73], all of which potentially muddle inferences about insect adaptation to temperature or other abiotic stressors [74].

Complicating the matter further, short duration extreme events may exert exceptionally strong selection pressure, resulting in phenotypes adapted to levels of abiotic stress not measured in a particular study [27,64,65]. Surviving exposure to extremes requires mounting a physiological response and can result in physiological damage, both of which likely alter responses to subsequent exposures to abiotic stressors in complicated ways [27,75–77]. And organisms may adapt to the predictability of extreme fluctuations rather than their amplitude. For example, flies exposed to unpredictable temperature fluctuations were less stress-resistant than those exposed to predictable temperature fluctuations of the same magnitude [78].

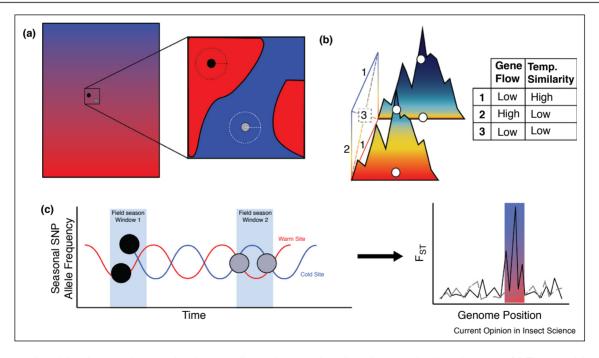
Individual insects are also likely responding to multiple, often interrelated abiotic challenges, and may vary in the measured phenotype in time and space for reasons that may be unrelated to a focal abiotic stressor [22]. For example, body size [74,79,80], age [81], nutritional state [82], pathogenic and beneficial microorganims [83], reproductive state, biotic [84] and anthropogenic chemicals [85] can all alter tolerance traits. Cross-talk and crosstolerance between traits [86] can alter insect responses to stressors but are rarely considered, particularly in the context of detecting adaptation. Awareness of these diverse effects when designing studies (see below) and implementation of standardized approaches to measuring relevant physiological traits [87,88] will help overcome potential confounding effects and generate robust evidence for physiological adaptation to abiotic stressors.

Separating signal from noise to detect adaptation with '-omics' data Population genomics of local adaptation

The search for genes influencing responses to environmental pressures like temperature has a long history from traditional genetics approaches in model insects like Drosophila melanogaster [89°]. More recently, 'omics tools have led to major advancements in understanding environmental adaptation across levels of molecular organization, from the effects of DNA sequence changes on protein coding variation, to changes in expression of this variation across environments. In this section we focus on population genomics, which has leveraged these developments for discovery of environment-associated loci in natural populations of model and non-model organisms [90°], especially where traditional genetics experiments are challenging. Statistical population genomics methods to detect loci (usually single nucleotide polymorphisms, or SNPs) with strong allele frequency differentiation among populations in different environments have aided the search for genes underlying local adaptation [91–93]. In just over a decade, investigations of adaptive variation have become nearly as commonplace in molecular ecology as estimating neutral demographic processes like dispersal [94]. Molecular tools to genotype SNPs in species with limited genome resources have facilitated such studies by reducing the genome to bioinformatically tractable subsets [6,95,96], and as more insect genomes are sequenced [97], whole genome resequencing will likely become the norm. Even with whole genome data, however, uncovering the genomic basis of locally adapted phenotypes remains challenging. Discussion of these challenges [7,91–93] has focused primarily on methodological and statistical concerns, with less consideration for appropriately sampling genotypes in time and space [98°,99].

Sampling individuals across spatial-environmental gradients is currently the most common approach to population genomic detection of adaptation. Insect examples include adaptation to high elevations in honey bees [18**], latitudinal gradients in *Drosophila* [100°], and gradients in temperature and precipitation in damselflies [101] and midges [17°]. Spatial variation represents the low hanging fruit for genome-environment association analyses, but still can present challenges. One issue is that abiotic gradients may correlate with spatial population structure, confounding isolation by distance and environmental adaptation [93,102]. Statistical approaches can model population structure when detecting environmental adaptation (e.g. [103,104]), but distance and environment can be further decoupled with creative sampling. Comparative analyses of multiple species can detect concordance across the same environmental gradient [105,106], the same abiotic gradient can be sampled in widely separated transects [107], or paired designs can leverage landscape heterogeneity by sampling genotypes from distinct environments at multiple spatial scales [92,108] (Figure 2). Such approaches are most effective when selection drives parallel changes across replicated environments, however, and may miss population-specific mutations. A second issue is that detecting local adaptation across heterogeneous landscapes requires relevant environmental data. But, as discussed above, environmental data are often only available at coarse spatial or temporal resolutions [109]. Whether this 'spatial gap' [8] is a problem for adaptation studies depends on the study question and organismal traits (e.g. dispersal distance, longevity). For long-lived species, genetic variation may reflect

Figure 2



Some issues of spatial and temporal complexity when sampling environmental gradients for genomic adaptation scans. (a) The potential spatial gap [8] between available environmental data and local-scale realities when sampling across an abiotic gradient (see also Figure 1a). In this case two genotypes from an intermediate value environment actually segregate by habitat, with activity ranges (dashed lines) restricted to discrete microenvironments, potentially masking any signature of local adaptation using coarse spatial data. (b) Mountains illustrate how complex environmental landscapes can be used to design paired sampling studies. In this case, pairing elevation and latitude extremes allows genotypes to be sampled from different temperatures at multiple spatial scales, in part decoupling confounding effects of gene flow when testing for environmental adaptation. This hypothetical species also illustrates how using latitude as a proxy for temperature without considering elevation could produce misleading adaptation scan results. (c) Temporally fluctuating selection pressures can produce oscillating allele frequencies [110**] for multivoltine species that can produce misleading signatures of local environmental adaptation in genomic data that depends on when samples are taken during a single field collection trip. Black genotype samples might produce a strong signal of differentiation (FST) near the seasonal locus, while gray genotypes show no evidence of differentiation between environments. Both results are misleading, the former because a conclusion would be made about the strength of local adaptation when both populations are responding similarly to the same environmental fluctuations at different times, and the latter because while no local adaptation is detected, another interesting form of selection from the environmental variable of interest is overlooked.

long-term bioclimatic patterns captured by annual means and extremes at large spatial scales. However, many insects will experience microclimates at finer scales than are represented in such data sets (Figures 1 and 2), and multivoltine species may experience temporal fluctuations in selection within a year. For such species, it will be important to both fully characterize relevant environmental variables, and carefully design collections so that samples are comparable among populations (Figure 1).

Many examples of rapid genomic evolution in response to environmental change in insects [101,110**,111*] suggest that effects of fluctuating selection on population genetic data may be underappreciated [98°]. For species with short generation times relative to environmental changes, intra-season fluctuations in allele frequencies from standing genetic variation could confound statistical genotypeenvironment associations, depending on when sampling is conducted (Figure 2). Importantly, the timing of such fluctuations may vary across a species range; Bergland et al. [110**] has provided some of the clearest evidence for seasonal selection on insect genomes using D. melanogaster populations from a latitudinal cline, with repeatable oscillations of allele frequencies observed within and between years at seasonal loci throughout the genome that could be recapitulated with spatial comparisons. In addition to selection favoring different genotypes in different environments, some genetic variants may be selected on by variation itself, including loci associated with seasonal rhythms or traits like diapause and circadian clocks [112,113]. Migratory species like monarch butterflies have additional complexities, as selection will shape responses to local climates [114], requiring consideration of the question 'which environment is local?' with respect to genomic variation. Finally, range expansions (e.g. of insect pests) highlight the importance of environmental adaptation associated with colonization of new environments [101,115]. Expansions produce spatially and temporally non-equilibrium scenarios that may complicate population genetics analyses; however, certain population genomics tools may be particularly effective at detecting adaptation in such situations [116]. So, spatio-temporally fluctuating selection can be strong in insect populations, but methods to detect its effects are in their infancy. Models incorporating time-series data or chronological sampling are potentially promising but require further development [117°].

Beyond genome sequence variation

Other 'omic technologies provide additional opportunities for uncovering the basis of environmental adaptation. DNA sequence variation can clearly contribute to local adaptation across environments through structural protein coding changes or mutations in regulatory regions that alter gene expression. However, mechanistic insights into tolerance of abiotic variation may often be more clearly revealed in other parts of the 'omic spectrum, including transcriptomics (gene expression), methylomics (epigenetics), or metabolomics (small molecules). While DNA sequences are stable within an individual, other layers of the molecular spectrum are variable across space, environment, time, and tissue [118,119]. This inherent responsiveness makes these methods ideal for determination of mechanisms underlying organismal sensitivity to environmental pressures, further illuminating links between genotype and phenotype. Ample evidence suggests that gene expression regulation under environmental stress contributes to adaptive phenotypes. For example, differences in transcription in flies are substantial after cold shock (-10°C) , but rare following prolonged cold hardening (0°C) [120]. Population (i.e. genotypic background) by environment effects also reveal that adaptive evolution may shape gene expression responses in individuals from regions with different conditions [121,122]. Gene expression is not only influenced by spatial variation [16**], but also responds to temporal (seasonal) variation [123]. For some traits, adaptation may not be detectable at genomic or transcriptional levels, requiring assays of other levels of the 'omic spectrum [120,124,125].

A multi-scale integrative approach

Many insects have large geographic distributions that span environmental gradients, so understanding adaptation across the species range is important. Recording abiotic data at high spatio-temporal resolution at each collecting locality may be impractical at these scales, where samples are often taken over multiple years or even from natural history collections [126]. Likewise, collecting physiology data, genome sequences, transcriptome sequences, and so on in all populations is infeasible, and traditional laboratory genetics experiments are difficult for many species. However, a multi-scale integrative approach may help address these limitations. One part of a project could include a biogeographic clinal adaptation study of many individuals and populations, incorporating population genomics to detect adaptation candidate genes and measurement of traits hypothesized a priori to be physiologically relevant (e.g. body size or wing size variation with latitude or altitude: [127]). Such observational studies could be combined with extensive spatial and temporal sampling of individuals and environmental conditions in focal populations, perhaps at the abiotic extremes of the study region. A more comprehensive suite of molecular assays, including RNAseq, epigenomics, and metabolomics in these focal populations could be directly tied to experimentally measured physiological variation, and cross-validated against results from large-scale analyses to predict how different sources of variation enable adaptation to abiotic conditions. Of course, fully addressing the question of adaptation ultimately requires fitness measurements for genotypes and phenotypes across environments; this will be a major challenge for most non-model organisms. Developing approaches to overcome such challenges and integrate distinct data types collected at different spatial and temporal resolutions will be necessary if we hope to make accurate and actionable predictions (e.g. [128,129,130°]) about insect evolution in contemporary and future landscapes.

Conflict of interest statement

Nothing declared.

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