



Original Contribution

Differences in Fungal Disease Dynamics in Co-occurring Terrestrial and Aquatic Amphibians

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Abstract: The fungal pathogen, *Batrachochytrium dendrobatidis* (*Bd*), has devastated biodiversity and ecosystem health and is implicated as a driver of mass amphibian extinctions. This 100-year study investigates which environmental factors contribute to *Bd* prevalence in a fully terrestrial species, and determines whether infection patterns differ between a fully terrestrial amphibian and more aquatic host species. We performed a historical survey to quantify *Bd* prevalence in 1127 *Batrachoseps gregarius* museum specimens collected from 1920 to 2000, and recent data from 16 contemporary (live-caught) *B. gregarius* populations from the southwestern slopes of the Sierra Nevada mountains in California, USA. We compared these results to *Bd* detection rates in 1395 historical and 1033 contemporary specimens from 10 species of anurans and 427 historical *Taricha* salamander specimens collected throughout the Sierra Nevada mountains. Our results indicate that *Bd* dynamics in the entirely terrestrial species, *B. gregarius*, differ from aquatic species in the same region in terms of both seasonal patterns of *Bd* abundance and in the possible timing of *Bd* epizootics.

Keywords: Chytridiomycosis, Chytrid, *Bd*, Direct-developing, Plethodontids, Salamanders

INTRODUCTION

Batrachochytrium dendrobatidis (*Bd*), a causal agent of the widespread and deadly amphibian disease chytridiomycosis, is a pathogen responsible for devastating loss of biodiversity (Skerratt et al. 2007; Fisher et al. 2009) and a likely driver of mass extinction (Wake and Vredenburg 2008). The pathogen *Bd* consists of multiple genetic lineages that vary in pathogenicity. The hypervirulent global panzootic

lineage of *Bd* (*Bd*GPL) is found on every continent with amphibians (Rosenblum et al. 2013; Byrne et al. 2017) and is a major contributor to the decline or extinction of hundreds of amphibian species (Stuart et al. 2004; Skerratt et al. 2007).

With hypothesized origins in Asia, *Bd*GPL (hereafter referred to as *Bd*) is a novel pathogen across much of its current distribution (O'Hanlon et al. 2018). This pathogen was likely spread globally during the last 50 to 120 years through amphibian trade (Fisher and Garner 2007; Rosenblum et al. 2013; O'Hanlon et al. 2018; Byrne et al. 2019). Because *Bd* was identified as the cause of chytridiomycosis in 1998 (Berger et al. 1998; Longcore et al. 1999), researchers have reconstructed *Bd*'s emergence using museum specimens. Retrospective techniques have helped ex-

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plain dramatic amphibian declines in Australia and Central America (Catenazzi et al. 2011; Cheng et al. 2011; Berger et al. 2016). The recent discovery in the Netherlands of a second pathogen which also causes lethal chytridiomycosis in amphibians, *Batrachochytrium salamandrivorans* (*Bsal*), underscores our need to understand the mechanisms of fungal pathogen spread in order to avoid the wider introduction of another devastating amphibian disease (Martel et al. 2013; Yap et al. 2015, 2017).

Transmission of *Bd* primarily occurs via water due to its flagellated zoospores (Berger et al. 1998; Rachowicz and Vredenburg 2004); as a result, *Bd* has been primarily studied in aquatic species, which are exposed to zoospores from both conspecifics and from re-infection (Kriger and Hero 2007; Berger et al. 2016). Though *Bd* zoospores are highly susceptible to desiccation (Piotrowski et al. 2004), they appear to survive for months in wet sand under laboratory conditions (Johnson and Speare 2005). *Bd* zoospores have also been found on environmental substrates from the forest floor to the canopy during disease outbreaks (Lips et al. 2006; McCracken et al. 2009; Kolby et al. 2015). Therefore, it is not surprising that *Bd* has been detected in a number of completely terrestrial amphibian species, including caecilians, Plethodontid salamanders, and direct-developing frogs (Cummer et al. 2005; Burrowes and Longo 2007; Weinstein 2009; Doherty-Bone et al. 2013; Gower et al. 2013; Muletz et al. 2014; Sette et al. 2015). These studies indicate that terrestrial transmission routes for *Bd* must exist, independent of aquatic-to-land vectoring driven by the emergence of metamorphosing amphibians (Kolby et al. 2015). While it is possible that infection among exclusively terrestrial amphibians occurs through contact with contaminated substrates, it is also likely to happen through skin-to-skin transmission (Rowley and Alford 2007; Kolby et al. 2015). Neither terrestrial transmission route has been experimentally demonstrated, nor few studies have explicitly studied disease dynamics of *Bd* in terrestrial hosts (Muletz et al. 2014; Kolby et al. 2015).

In this study, we use museum specimens to reconstruct historical *Bd* infection prevalence in the fully terrestrial gregarious slender salamander, *Batrachoseps gregarius* (Jockusch et al. 1998), in the inland region of California (ranging from the eastern edge of California's Central Valley to the western slope of the Sierra Nevada mountains). This species can be found in open grassland habitat in low elevations as well as high elevation coniferous forests. *B. gregarius* are fully terrestrial, direct-developing salamanders which nest communally and exhibit aggrega-

tion behaviours involving skin-to-skin contact (Jockusch et al. 1998). *B. gregarius* remains terrestrial from egg to adulthood, has extremely low vagility, and has highly gregarious nesting behaviour, all of which allows for an examination of likely terrestrial transmission of *Bd*. This species is useful for studying the historical spread of *Bd* due to its high representation in museum collections (1511 specimens listed on VertNet [<http://www.vertnet.org>]), and the likelihood that individuals spread the disease through direct social contact rather than via aquatic zoospores.

We performed a historical survey to quantify *Bd* infection detection in *B. gregarius* museum specimens collected from 1920 to 2000. We explored environmental factors that may contribute to historical *Bd* infection in *B. gregarius*, as well as the relevant time scales for interpreting the influence of these environmental factors. In order to determine if *Bd* infection levels have changed over time, we revisited a number of historically surveyed sites (some which revealed historical *Bd* infection) and tested these contemporary *B. gregarius* populations for *Bd*. Finally, we compared *Bd* detection rate in the fully terrestrial *B. gregarius* to historical and contemporary specimens from 10 species of aquatic anurans and three species of semi-aquatic salamanders from the Sierra Nevada mountains. Our goals were to investigate which environmental factors contribute to *Bd* infection in a fully terrestrial species, and to determine whether infection patterns differ between a fully terrestrial amphibian and host species with more aquatic lifestyles.

METHODS

Historical Survey

We tested for *Bd* in all available *B. gregarius* museum specimens collected in Fresno, Madera, Mariposa, Stanislaus, and Tulare counties (California) housed permanently at two natural history museums, the California Academy of Sciences and the Museum of Vertebrate Zoology at the University of California, Berkeley (Supp. Table 1). We tested 1127 specimens available at the time (out of 1512 specimens listed across all institutions on VertNet) for *Bd*.

We collected skin swabs from museum specimens and live, field-caught salamanders using standard *Bd* skin swabbing techniques (Boyle et al. 2004; Hyatt et al. 2007; van Rooij et al. 2011): specimens were stroked 10 times each dorsally and ventrally and 5 times on each side with a

MW113 dry swab (Medical Wire and Equipment Company). Swabs were dried and stored in 1.5 ml microcentrifuge tubes at 4°C until DNA extraction (Cheng et al. 2011). Standard DNA extraction and real-time PCR quantification techniques were used: samples were run in singlicate with standard controls of 0, 0.1, 1, 10, and 100 zoospore equivalents (ZE) (Boyle et al. 2004; Hyatt et al. 2007; Cheng et al. 2011). We multiplied the qPCR genomic equivalents (GE) by the PCR dilution factor of 80 in order to quantify the number of zoospore equivalents on each swab, Z_{swab} score (Briggs et al. 2010; Vredenburg et al. 2010). Because the likelihood of false negatives when sampling in singlicate is $\sim 40\%$ (Cheng et al. 2011), we describe historical *Bd* abundance as the detection rate of positive specimens.

We obtained historical *Bd* data (1900–2009) for aquatic-breeding anuran species in the California Sierra Nevada region from Vredenburg et al. 2019, as well as additional anuran *Bd* records from that region (data repository: AmphibiaWeb’s disease portal: <https://amphibiandisease.org>). These include 2428 specimens (1033 of which were live-caught) of *Anaxyrus boreas*: 58 (0), *Anaxyrus canorus*: 1254 (999), *Hyla regilla*: 355 (32), *Rana boylei*: 100 (0), *Rana cascadae*: 1 (0), *Rana catesbeiana*: 48 (0), *Rana draytonii*: 1 (0), *Rana muscosa*: 177 (2), *Rana pipiens*: 4 (0), and *Rana sierrae*: 430 (0). We also obtained 427 historical records (1900–2009) from Sierran aquatic-breeding salamanders *Taricha granulosa*: 91, *T. sierrae*: 18, and *T. torosa*: 317 originally published in Chaukulkar et al. 2018. Sampling range extents of these species were defined in Quantum GIS v.3.4 by generating convex hulls using minimum bounding geometry.

Contemporary Sampling

In addition to comparing contemporary and historical *Bd* detection rate, we also set out to compare yearly variation in contemporary *Bd* detection rate by collecting skin swab samples from field sites in 2013 and 2014. In 2013, we revisited 16 sites from the historical survey. We detected *Bd*-positive salamanders at two sites, which we revisited in 2014 for more extensive field sampling. All *B. gregarius* found in the field were swabbed for *Bd* testing, measured, weighed, and released within 5 min. We wore gloves when handling salamanders, and changed gloves between individual specimens.

Statistical Analysis

We used R (R Core Team 2014) for all statistical tests. We compared the *Bd* detection rate in historical and live-collected field samples over successive time periods using a two-tailed equal proportions test. We generated credible intervals using an exact binomial test with a confidence level of 95%. The R package MASS (Venables and Ripley 2002) was used to perform a generalized linear model (GLM); this was done to find 1) which environmental factors contribute to *Bd* prevalence, and 2) what time scale is most relevant for those same environmental factors.

We obtained daily precipitation and daily temperature values for each sample month from NOAA’s Daily Summaries dataset (<https://www.ncdc.noaa.gov/cdo-web/>) for all weather stations in Fresno, Madera, Mariposa, Stanislaus, Tulare, and nearby Kern and Tuolumne counties. We used the data from the nearest weather station to assign daily values to each collection site. We obtained elevation data for all historical specimen collection sites using USGS’s National Map bulk point query tool (<https://viewer.nationalmap.gov>). The nearest distance from historical collection sites to freshwater was calculated in Quantum GIS using an inland hydrologic features basemap from CalAtlas at CA.gov (<http://atlas.ca.gov>).

Before performing the GLM, we assessed the collinearity of the environmental variables using a Pearson correlation test. We tested historical results for spatial autocorrelation, a high degree of clumping in *Bd*-positive specimens, using the R package gstat (Pebesma 2004; Gräler et al. 2016). We limited the test for autocorrelation to groups of historical sites within 10 km of one another, as amphibian dispersal events beyond this distance are rare (Smith and Green 2005).

Bd count values were zero inflated; therefore, we used a negative binomial distribution (Zuur et al. 2012). To account for variable sampling effort between sites, the natural log of total sample size per site was included as a model offset. We included the following environmental variables: average daily precipitation, average maximum daily temperature, elevation, and distance from historical collection site to the nearest fresh body of water. Model variables could not contribute to the prevalence of *Bd* prior to its arrival at any particular site; therefore, all variables were modelled in interaction with the year of sample collection. A significant interaction term indicates that the effect of an environmental variable has changed over time. We elected not to include collection site as a factor in the GLM; our

models include the assumption that every collection site/year combination is an independent data point. This results in a small degree of pseudoreplication since 10 out of 157 sites were sampled in multiple years (12 of 168 total site/year combinations). Of those, 6 sites were *Bd*-negative in all sample years.

Time scale is relevant when assessing the effect of daily precipitation and maximum daily temperature, as both may have short-term and long-term effects on *Bd* dynamics. Therefore, we calculated the average values for those two variables across time intervals ranging from 1 to 12 months long prior to the month each historical specimen was collected. When performing model selection for each of these 12 time intervals for precipitation and temperature, we began with a beyond-optimal model that consisted of the interactions between year of sample collection and each of the environmental variables. We selected the best fit model for each of the 12 models using a reverse-stepwise procedure, based on the significance of model factors and a Wald test comparing AIC values (Zuur et al. 2009). McFadden's Pseudo- R^2 was used to compare models at different time scales (Hemmer et al. 2018).

RESULTS

Historical Survey

Bd-positive *B. gregarius* museum specimens were detected at 26 out of 157 historical specimen collection sites (Fig. 1, left panel). Sites were defined as discrete GPS coordinates in the museum database; the closest two sites were 28 m apart. We found no *Bd*-positive samples from 1920 to 1971, a time period that included 346 museum specimens (Supp. Table 1). The oldest *Bd*-positive *B. gregarius* specimens were collected in 1973 at several nearby sites in northern Mariposa and Stanislaus counties, as well as one site to the south in Tulare county (Fig. 1, right panel). *Bd* detection rate was significantly higher in the 1990s compared to any other decade (Fig. 2), but was not significantly different between any two other decades (for *p*-values, see Supp. Table 2). Similarly, infected specimens collected during the 1990s had an average Z_{swab} score an order of magnitude larger than the other decades (1970: 1.695, 1980: 4.270, 1990: 106.5, 2000: 11.28). Ten sites were sampled for museum collections in multiple years; four of these sites had *Bd*-positive specimens, primarily in later sampling years (4-

Tulare, 5-Tulare, 13-Madera & 14-Mariposa) (Supp. Table 3).

The sampling region for *B. gregarius* historical specimens, along the western slope of the southern Sierra Nevada mountains, overlapped with approximately 18% of all Sierran aquatic-breeding anuran samples. The *Taricha* sampling region along the western slope of the Sierras overlapped approximately 18% of anuran samples and 94% of *B. gregarius* samples. Both *B. gregarius* and *Taricha* sampling regions overlapped only 5% of anuran samples. The earliest *Bd*-positive from Sierra Nevada records was from a *Rana sierrae* collected in 1939 in the northern Sierra Nevada (Vredenburg et al. 2019). The first *Bd*-positives within the range of *B. gregarius* sampling were two *Taricha sierrae* collected in 1960; the first anuran positive was a *Hyliola regilla* collected in 1962; the first *Bd*-positive *B. gregarius* were collected 11 years later. Between the 1970's and 2000's, we detected *Bd* in *B. gregarius* at a lower rate compared to Sierran anurans except during the 1990's (70's: $P < 0.01$, 80's: $P < 0.01$, 90's: $P = 0.11$, 00's: $P = 0.03$) (Fig. 3). Sampling effort for *B. gregarius* was higher than for anurans during the 1970's and 1980's, yet overall *Bd* abundance was significantly lower than anurans (Fig. 3); additionally 67% of *B. gregarius* *Bd* positives during the 1970's originated from a single site. Detection rates of *Bd* in *Taricha* were statistically the as *B. gregarius* in all decades (60's–00's: $P > 0.05$), and were lower than Sierran anurans from the 1970's–2000's (40's–60's: $P > 0.05$, 70's–90's: $P < 0.01$, 00's: $P = 0.02$).

Batrachoseps gregarius and *Taricha* specimen collection was primarily performed between December and April, while sampling of anuran species primarily occurred May–September (Fig. 4). *Bd* was most abundant in March, April, and June in *B. gregarius* and *Taricha*, and in June–August in anuran species (Fig. 4, Supp. Figure 1). The proportion of *Bd*-positive *B. gregarius* was significantly higher in the cool/wet season (November–April) than in the hot/dry season (May–October) (Fig. 5) ($\chi^2 = 10.50$, $df = 1$, $P < 0.01$); a similar pattern was found in *Taricha* ($\chi^2 = 10.50$, $df = 1$, $P < 0.01$); however *Bd* detection in anuran species did not differ significantly between seasons ($\chi^2 = 0.0010$, $df = 1$, p value = 0.97). For Sierran anurans, the proportion of *Bd*-positive specimens each month did not differ significantly between the samples from the entire Sierra Nevada range and those overlapping the range of *B. gregarius*, except during the month of August, when the specimens from the total range had significantly higher rates of *Bd* detection (overlapping range: 3/80, total range: 57/426; $P = 0.02$).

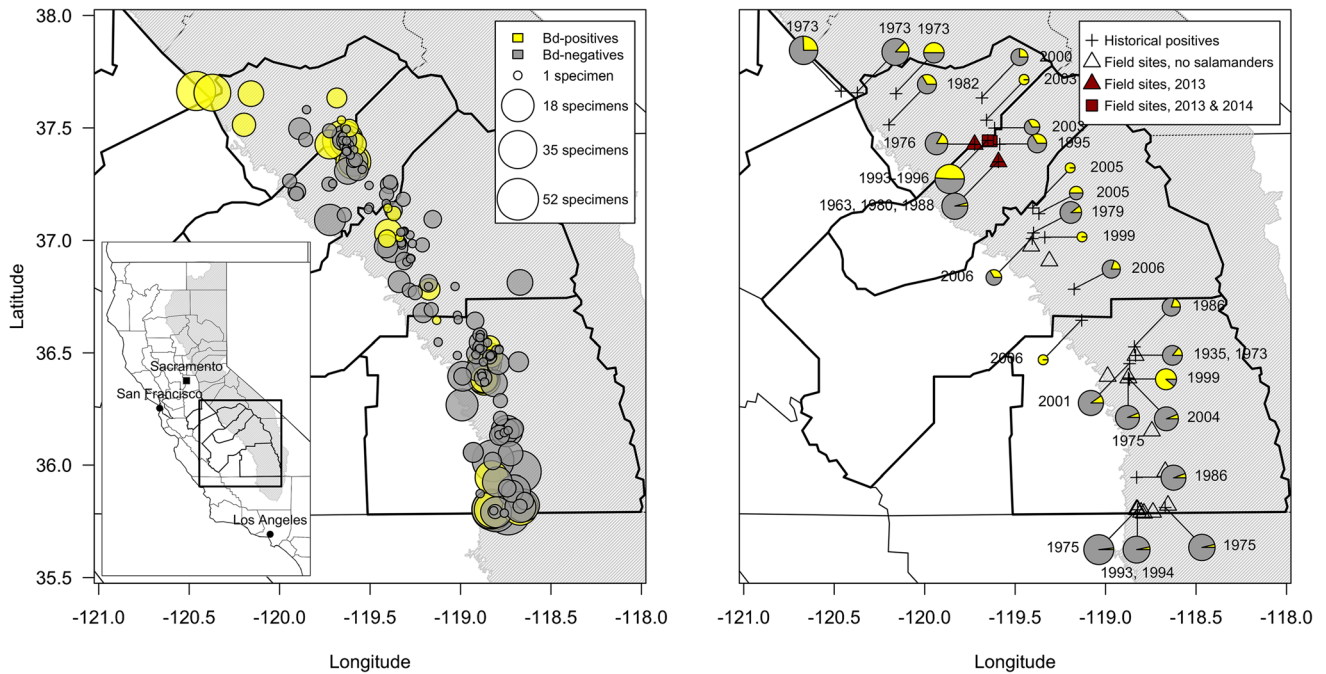


Figure 1. Left inset: Map of California showing the study area counties in bold outline and the Sierra Nevada mountains shaded grey. Left panel: *Batrachoseps gregarius* historical museum survey results. The number of samples tested for *Batrachochytrium dendrobatidis* (*Bd*) from each site is indicated by the size of each dot (log scale). *Bd*-negative sites are shown in grey, while *Bd*-positive sites are shown in yellow. Right panel: Pie charts indicate the proportion of *Bd*-positive *B. gregarius* specimens at each *Bd*-positive historical site (26 sites). *B. gregarius* museum localities revisited in 2013 and 2014—open triangles indicate sites where no salamanders were found during revisit, dark red triangles indicate sites visited in 2013 only, and dark red squares indicate sites visited in 2013 and 2014.

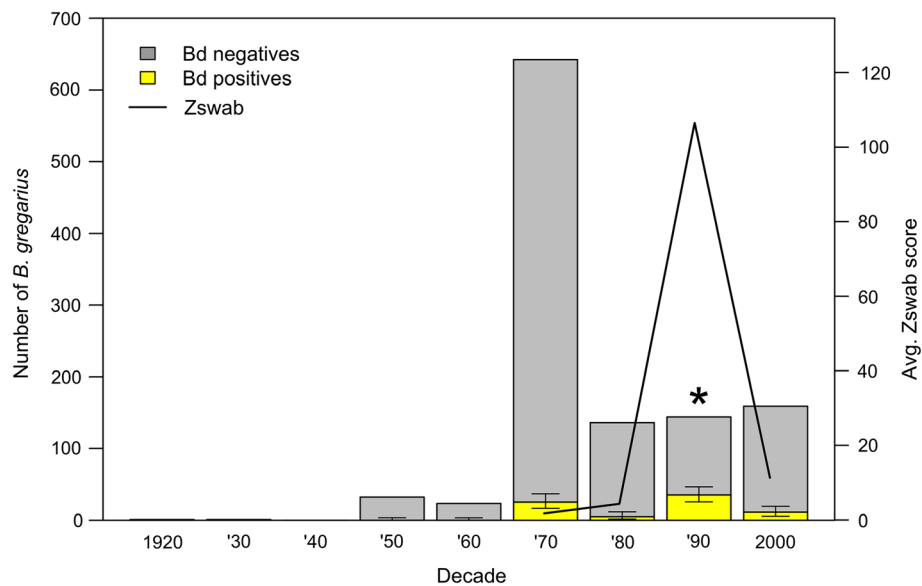


Figure 2. Proportion of *Bd*-positive *Batrachoseps gregarius* specimens and average Z_{swab} score by decade. Grey bars' height indicates sample size per decade, and yellow bars indicate proportion infected with *Bd*. The black line indicates average Z_{swab} score per decade. Specimens collected in 1990 had a significantly higher prevalence of *Bd* than other decades (indicated with *), and higher average Z_{swab} score.

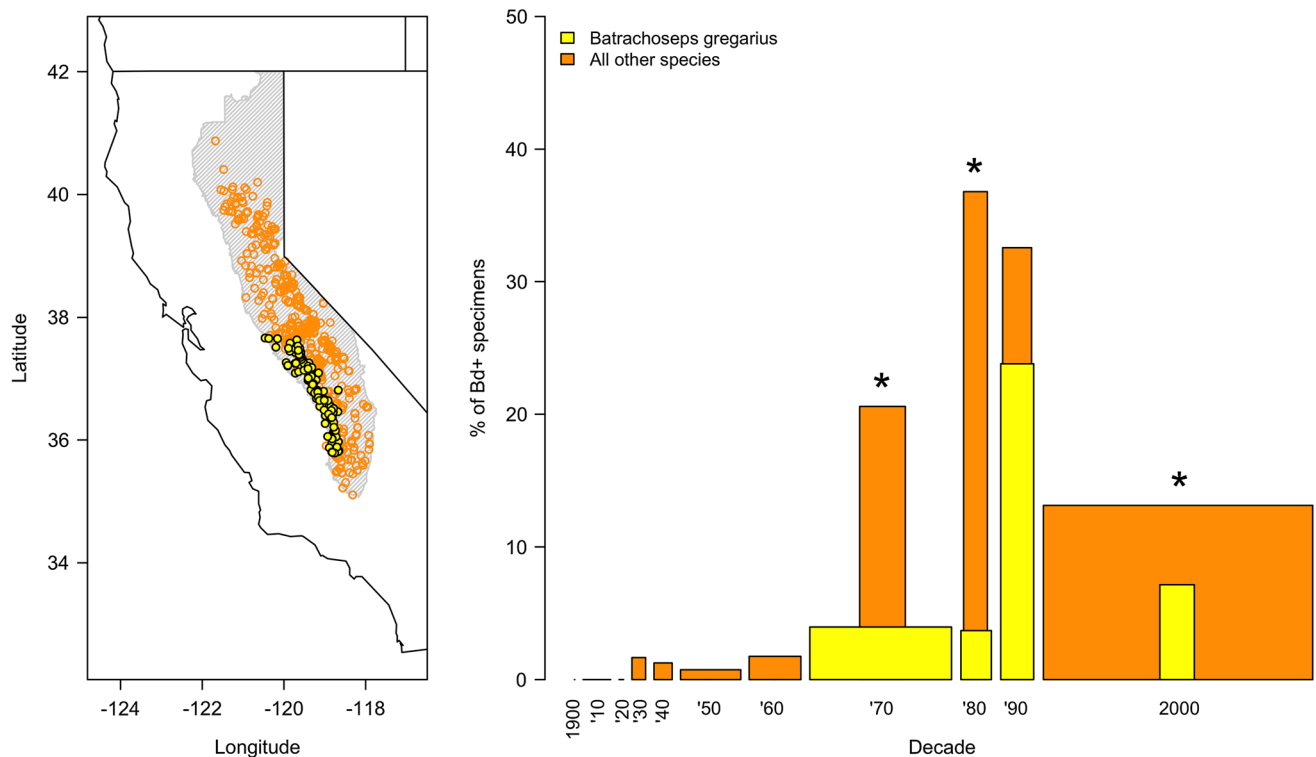


Figure 3. Left panel: Map of *Bd* sampling in the Sierra Nevada mountains including data from Vredenburg et al. 2019. Stippled grey fill shows the extent of the Sierra Nevada mountains. *Batrachoseps gregarius* specimens are shown in yellow, all anuran species are shown in orange. Right panel: Bar chart showing the proportion of *Bd*-positive specimens detected in the Sierra Nevada mountains by decade. Yellow bars show *Bd* prevalence for *B. gregarius*. Orange bars show *Bd* prevalence for all anuran species. Bar width is proportional to sample size. Stars indicate decades in which *Bd* prevalence in *B. gregarius* differs significantly from anuran Sierra Nevada host species.

The proportion of *Bd* positives was not significantly different between *Taricha* specimens collected during their aquatic or terrestrial life stages ($P = 0.59$).

Historical GLM

The average distance from each historical *B. gregarius* collection site to the nearest weather station with data available during the specimen collection year was 13.24 ± 7.16 km. Home range size for *Batrachoseps* salamanders likely varies by species, but recorded dispersal distances are typically small, ranging from 1.7 to 18.3 m (Hendrickson 1954; Cunningham 1960). Spatial autocorrelation tests show that *Bd* presence is independent across sites above 38 m apart (Supp. Figure 2); only one pair of sites in our historical samples was below this distance apart (28 m), and both of these sites tested negative for *Bd*. Therefore, the geographic location of our historical sites relative to one another is unlikely to have an effect on the historical GLM, particularly with respect to the multi-decade sampling timeframe.

The reverse-stepwise procedure for beyond-optimal models that began with environmental variables of 12-, 11-, 10-, 9-, 4-, 3-, 2-, and 1-month time intervals prior to sample date resulted in best models that contained only the interaction between elevation and year of sample collection (AIC: 203.65.17, $2 \times \log\text{-lik}$: -189.652) (Table 1). For 8-, 7-, 6-, and 5-month time intervals, the best models contained elevation and average maximum daily temperature in interaction with the year of sample collection. However for the 8-month model, year and the intercept had P values > 0.05 . We used McFadden's Pseudo- R^2 to compare these models to the fitted data (8-month R^2 : 0.28, 7-month R^2 : 0.30, 6-month R^2 : 0.31, 5-month R^2 : 0.28). We report the parameters for the model with the best fit, the 6-month model (AIC: 203.65, $2 \times \log\text{-lik}$: -189.652) (Table 1, Supp. Figures 2 & 3).

Contemporary Sampling

In 2013, we visited 16 sites where *B. gregarius* specimens were collected during historical surveys. We detected *Bd* in

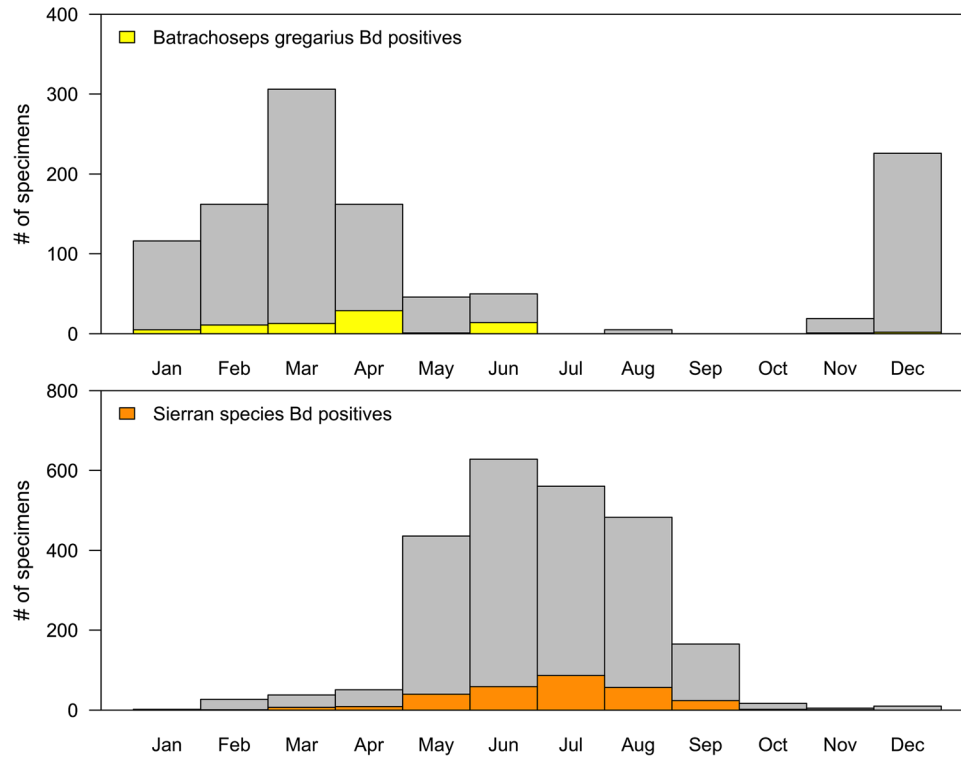


Figure 4. Historical sampling effort of *Batrachoseps gregarius* (top panel) and Sierra Nevada anuran species (bottom panel) by month. Grey bars show total sampling effort (1127 *B. gregarius*, 2423 Sierra Nevada anurans); coloured bars show the proportion of *Bd* positives per month collected.

historical specimens collected at six of those 16 sites. We found salamanders at only four of the 16 field sites (Fig. 1, right panel). Three of those four sites had historical *Bd*-positives, and three of those four sites were historically sampled in multiple years: site 0-Madera (1963: 0/11 samples; 1993: 0/6), site 8-Mariposa (1976: 2/12), site 13-Madera (1963: 0/12, 1980: 0/5, 1988: 1/7), site 14-Mariposa (1993: 0/1, 1994: 9/17, 1994: 13/26, 1996: 1/3).

We sampled salamanders for contemporary *Bd* at four sites in 2013, and detected *Bd* at two sites: 0-Madera and 14-Mariposa (Table 2). We revisited these sites in 2014 for more extensive sampling. In 2013, the proportion of *Bd*-positive salamanders was the same among all four field sites sampled (i.e. the two negative sites did not have enough samples to rule out the presence of *Bd*), but in 2014, the proportion of *Bd*-positive salamanders was significantly higher in 14-Mariposa than 0-Madera (2013: P value = 0.81; 2014: P value = 0.03). The proportion of *Bd*-positive salamanders held steady from 2013 to 2014 at 0-Madera but increased in 2014 at 14-Mariposa (0-Madera: P value = 0.32; 14-Mariposa: P value = 0.04) (Table 2).

DISCUSSION

Bd was present in California as early as 1915 (Adams et al. 2017) and in the Sierra Nevada mountains as early as 1939 (Vredenburg et al. 2019), but apparently it did not spread rapidly. In multiple retrospective studies of *Bd* in California, detection rates of *Bd* began to increase during the 1960s and 1970s, indicative of an epizootic spread that peaked in the 1980s or 1990s, though many of these studies have focused on coastal California (Padgett-Flohr and Hopkins 2009; Huss et al. 2013; Sette et al. 2015; de León et al. 2017; Chaukulkar et al. 2018; Vredenburg et al. 2019). Concurrent high pathogen prevalence and high zoospore levels support the hypothesis that *Bd* reached epizootic levels across parts of California during those two decades.

It is important to note that *Bd*-positive specimens collected in California prior to 1960 were scattered in both time and space and were apparently not followed by epizootic spread and outbreaks. These may represent failed invasions—disease introductions which disappeared from host populations (Anderson and May 1979; Briggs et al. 2010). Early positives and subsequent fadeout is apparent in pre-1960 Sierran anuran samples (Vredenburg et al.

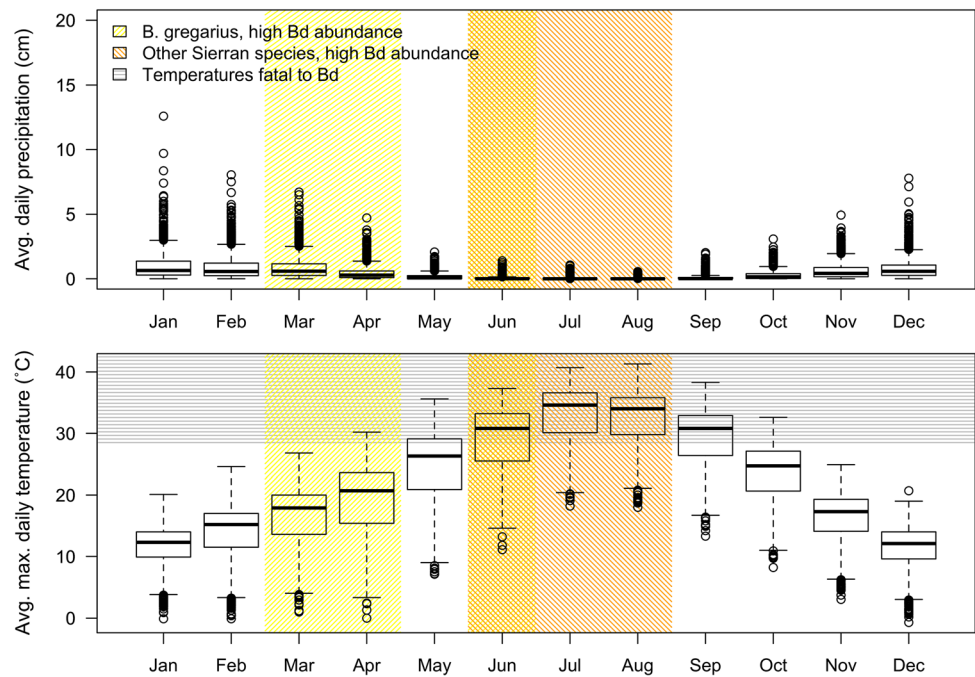


Figure 5. Top panel: Average daily precipitation (cm) by month for 1963–2009 for Fresno, Madera, Mariposa, Stanislaus, and Tulare counties, California. Bottom panel: Average maximum daily temperature (°C) by month for Fresno, Madera, Mariposa, Stanislaus, and Tulare counties. Yellow (downward hash) area shows the 3 months with highest *Bd* detection rate in *Batrachoseps gregarius*, and the orange area (upward hash) shows the 3 months with highest *Bd* prevalence in other Sierra Nevada anuran *Bd* hosts. Grey box (horizontal hash) shows lethal temperature for *Bd*.

Table 1. Historical GLM Explanatory Variables’ Estimated Value and Significance for the Best Model for: 12-, 11-, 10-, 9-, 4-, 3-, 2-, and 1-Month Time Periods, and the 6-Month Time Period.

12-, 11-, 10-, 9-, 4-, 3-, 2-, 1-month model: <i>Bd</i> prevalence ~ Year		
(Intercept)	21.36	0.72
Year	− 0.0121	0.03*
Elevation (m)	− 0.1500	0.69
Elevation × Year	0.0001	0.03*
6-month model: <i>Bd</i> prevalence ~ Elevation + AvgTmax, 6mo) × Year		
(Intercept)	458.1	0.02*
Year	− 0.2297	< 0.01*
Elevation (m)	− 0.2230	0.02*
Avg. daily maximum temperature, 6 mo. (°C)	− 22.33	0.02*
Elevation × Year	0.0001	< 0.01*
Temperature × Year	0.0111	0.02*

2019), but not in *B. gregarius* where *Bd* steadily increased in prevalence after its first emergence in the 1970s. While *Bd* detection rates for Sierran anurans peaked in the 1980s and remained high through the 1990s, the *Bd* peak in *B. gregarius* was offset by a decade, reaching epizootic levels in the 1990s. *Taricha* positives appear earlier than *B. gregarius*,

despite lower sampling effort, but also peak in the 1990s. Difference in timing are likely explained by *Bd*’s mode of transmission switching between density-dependent transmission in aquatic environments to slower frequency-dependent transmission in terrestrial environments.

Batrachoseps gregarius and aquatic Sierran anurans showed clear seasonal differences in *Bd* abundance, providing evidence of a unique terrestrial transmission mode. Specifically, *Bd* detection in *B. gregarius* was significantly lower during the hot/dry season (May–October) compared to the cool/wet season (November–April); there was no such seasonal trend for Sierran anurans. One explanation for this result is that aquatic amphibians can potentially be exposed across seasons, as *Bd* zoospores persist in freshwater bodies (Chestnut et al. 2014). Because the mechanisms of *Bd* exposure in a fully terrestrial host are likely limited to skin-to-skin transmission or contact with contaminated substrate (Berger et al. 2016), exposure is unlikely during hot/dry summer months when *Batrachoseps* salamanders burrow deep underground to escape desiccation (Hendrickson 1954; Cunningham 1960). *Taricha* shows a seasonal pattern of *Bd* more that is similar to *B. gregarius* than stream-breeding anurans. However, *Taricha*'s aquatic breeding occurs predominantly January–May (Stebbins 2003), which may account for the earlier seasonal peak. However, these results may also reflect elevational differences in *Bd* seasonality, since some of the range for aquatic Sierran anurans is under snow during winter, affecting capture rates. Ultimately, additional sampling is needed to confirm these seasonal patterns among terrestrial salamanders, aquatic-breeding salamanders, and aquatic-breeding anurans.

The delay between the onset of the cool/wet season in November and the April peak in *Bd* detection rate in *B. gregarius* matches the historical GLM results, which indicate a six-month time interval is best for assessing the impact of climate factors (temperature) on *Bd* levels in this species. Because the majority of *Bd*-positive *B. gregarius* were collected in February–June, this six-month time frame begins in August–December and extends into the cool, rainy winter. This interval may reflect the duration of the exposure period for salamanders, beginning when the rains start, and *Batrachoseps* become more socially active at the surface.

The GLM includes significant interactions between year and average daily maximum temperature, as well as year and elevation. Both interactions have saddle-shaped curves, with earlier (1970s) positives occurring at lower temperatures and lower elevations compared to later (2000s) positives (Supp. Figure 2). The change in the effect of temperature and elevation over time may reflect differences between the introduction of *Bd* and post-epizootic dynamics. In addition, the pattern of early *B. gregarius*

positives at lower elevations with *Bd* appearing at higher elevations in later years is consistent with human activity driving *Bd* emergence (Chestnut et al. 2014). The residuals of both GLMs are large, particularly at higher levels of *Bd* (Supp. Figure 3). This is likely due to the fact that our model explores landscape-level factors affecting *Bd*, ignoring factors that might influence local disease dynamics.

At the local population level, pathogen prevalence is driven by the transmission rate among hosts in combination with host susceptibility (May and Anderson 1979). Unfortunately, since our contemporary sampling occurred during the 2012–2014 California drought, the most severe drought in the last 1200 years (Griffin and Anchukaitis 2014), we were unable to explore factors such as host aggregation size that may contribute to *Bd* detection rate at the local level. Salamanders were absent from the majority of sites visited in 2013, though they were likely to have been present underground. The four sites where we did find salamanders in 2013 were located near creeks, and we even found communal nests at three sites. 2014 was the worst drought year in California (Griffin and Anchukaitis 2014), and we only found salamanders at the two sites. Future research on the social *B. gregarius* should prioritize a focus on within-site patterns of infection.

With the recent discovery of second chytridiomycosis-causing pathogen, *Batrachochytrium salamandrivorans* (*Bsal*) (Martel et al. 2014), it is important to understand how these pathogens become established as they enter new geographic regions and how they spread through a terrestrial and aquatic habitats. Climate suitability models predict that within 100 years of introduction, *Bsal* has the potential to spread across the range of nearly every North America salamander species (Yap et al. 2017). Historical *Bd* studies are crucial because they increase our understanding of how these pathogens spread in both time and space across the backdrop of species with different life histories and behaviours. Though aquatic species have been the focus of most *Bd* research, direct-developing host species (i.e. Plethodontid salamanders) are also extremely sensitive to *Bd* (Mesquita et al. 2017). Many species of direct-developing tropical frogs have been devastated by *Bd* (Longo and Burrowes 2010; Catenazzi et al. 2011). Our results reinforce previous studies that suggest that declines in amphibian species are highly influenced by host species' terrestrial lifestyle (Lips et al. 2003).

Salamanders are the most abundant terrestrial vertebrates in North American forests (e.g. *Batrachoseps* in California) and facilitate important carbon cycle functions

such as leaf litter retention and carbon capture (Best and Welsh 2014); therefore, their susceptibility to *Bd* could have important implications for biodiversity and ecosystem function. The impact of chytridiomycosis on terrestrial amphibians in North America may not only threaten biodiversity directly, it may also have major impacts on carbon cycling and storage, compounding the threat of *Bd* in amphibians throughout the world. Our data indicate that *Bd* dynamics in this entirely terrestrial species of amphibian differs from aquatic species in the same region with both seasonal patterns of *Bd* detection rate and in the possible timing of *Bd* epizootics.

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