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OPEN Fitness estimates from experimental infections predict the long-term strain structure of a vector-borne pathogen in the field

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The populations of many pathogen species consist of a collection of common and rare strains but the factors underlying this strain-specific variation in frequency are often unknown. Understanding frequency variation among strains is particularly challenging for vector-borne pathogens where the strain-specific fitness depends on the performance in both the vertebrate host and the arthropod vector. Two sympatric multiple-strain tick-borne pathogens, Borrelia afzelii and B. garinii, that use the same tick vector, Ixodes ricinus, but different vertebrate hosts were studied. 454-sequencing of the polymorphic ospC gene was used to characterize the community of Borrelia strains in a local population of *I. ricinus* ticks over a period of 11 years. Estimates of the reproduction number (R_0), a measure of fitness, were obtained for six strains of *B. afzelii* from a previous laboratory study. There was substantial variation in prevalence among strains and some strains were consistently common whereas other strains were consistently rare. In B. afzelii, the strain-specific estimates of R₀ in laboratory mice explained over 70% of the variation in the prevalences of the strains in our local population of ticks. Our study shows that laboratory estimates of fitness can predict the community structure of multiple-strain pathogens in the field.

Many pathogen populations consist of multiple strains or mixed infections in their host¹⁻³. From a public health perspective, the study of multiple-strain pathogens and parasites is important for a number of reasons. Strains belonging to the same pathogen species can show enormous variation in their ability to establish infection and cause disease^{4, 5}. Mixed infections can induce more pathology and disease than single-strain infections⁶⁻⁸. Multiple-strain pathogens complicate the development of vaccines and anti-parasite drugs^{2,9}. The use of vaccines and anti-parasite drugs can induce strong selection on multiple-strain pathogen populations and result in the competitive release of strains that are not targeted by human medicine¹⁰⁻¹³. Multiple-strain infections are of further interest to evolutionary biologists because competition between strains influences the evolution of virulence³.

Studies on multiple-strain pathogens have shown that some strains are consistently more common than others over time and/or space14-17. A fundamental question is therefore to understand the genetic and phenotypic factors that underlie this variation in frequency among strains. For example, in Streptococcus pneumonia, the thickness and structure of the capsule were good predictors of whether a given serotype was common or not¹⁶. In the case of vector-borne pathogens, the search for predictive phenotypes is complicated by the fact that the frequency of a particular strain depends on its performance in both the vertebrate host and the arthropod vector. Recent developments in so-called next generation population matrix models now allow scientists to combine the relevant transmission components of vector-borne pathogens into the reproduction number (R_0) , an inclusive measure of fitness^{18, 19}. In conjunction, the development of next generation sequencing methods has greatly enhanced our ability to detect multiple infections in individual hosts^{20, 21}. In the present study, we combined these two next generation methods to better understand the strain-specific prevalence distribution in a tick-borne pathogen.

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Borrelia afzelii and *B. garinii* are two species of tick-borne spirochete bacteria that cause Lyme borreliosis in humans²². In Europe, the main vector for both pathogen species is the hard tick *Ixodes ricinus*. The two immature tick stages, larva and nymph, take a single blood meal to develop into the next stage²³. Larval ticks acquire spirochetes after feeding on an infected reservoir host and develop into infected nymphs that transmit the pathogen the following year to the next generation of reservoir hosts. *B. afzelii* and *B. garinii* are specialized on different classes of vertebrate hosts: rodents and birds, respectively²³⁻²⁶, and therefore rarely occur together in the same tick²⁷⁻³⁰. Local populations of both *Borrelia* species consist of multiple strains^{21, 31-34}, which are often defined by the highly polymorphic, single-copy *ospC* gene^{35–38}. In the present study, we used the *ospC*-typing system to study mixed-strain infections within each of the two *Borrelia* species, as others have done previously^{21, 31, 33, 34, 39-42.}

The first purpose of the present study was to test whether laboratory estimates of strain-specific fitness could predict the strain structure of *Borrelia* pathogens in the field. We had recently used a laboratory Lyme borreliosis system that included *Mus musculus* mice and *I. ricinus* ticks to show that there was significant variation in fitness among six different *ospC* strains of *B. afzelii*⁴³. For each of the six strains, we measured the three most important fitness components of any vector-borne pathogen: vector-to-host transmission, host-to-vector transmission, and co-feeding transmission⁴³. We then used next generation matrices to estimate the reproduction number (R_0) for each of the six strains⁴³. These strains originated from a field site near Neuchâtel where the local tick population had been sampled over a period of 11 years to create a collection of isolates of *B. afzelii* and *B. garinii*. We had recently estimated the diversity of *ospC* strains in these tick-derived isolates using 454-sequencing²¹. These two studies therefore provided a unique opportunity to test whether laboratory estimates of strain-specific fitness can predict the strain structure of *Borrelia* pathogens in the field.

The second purpose of the present study was to test whether the prevalences of the different ospC strains were stable or fluctuating over time. A review on the evolutionary ecology of LB pathogens emphasized the importance of studying temporal variation in the frequencies of *Borrelia ospC* strains²². A number of Lyme disease researchers have predicted that the frequencies of the ospC strains should cycle over time^{22, 44, 45}. Thus long-term studies are important because they may improve our understanding of the ecological factors that shape the dynamics of multiple-strain *Borrelia* pathogens. In addition, for the laboratory estimates of fitness to have predictive value, the ospC strain structure should be stable over time so that some strains are consistently more common than others. In contrast, if the ospC strains cycle between being rare and being common, the laboratory estimates of R₀ are unlikely to predict the long-term average strain-specific prevalences. The present study therefore provided a unique opportunity to test whether the prevalences of the ospC strains are stable or fluctuating over time in two sympatric *Borrelia* species.

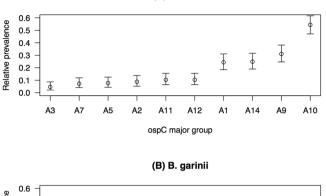
Results

Background. The University of Neuchâtel has a large collection of *B. afzelii* and *B. garinii* isolates that were obtained from a local population of *I. ricinus* nymphs over a period of 11 years. We had previously characterized the community of *ospC* strains in a stratified random sample of these isolates using 454-sequencing²¹. The stratified random sample contained a maximum of 20 isolates for each of the 22 combinations of *Borrelia* species and year, resulting in a total of 193 isolates of *B. afzelii* and 190 isolates of *B. garinii*²¹. We had previously assigned the *ospC* gene sequences to a limited set of distinct clusters, the so-called *ospC* major groups (oMGs), of which 10 belonged to *B. afzelii* and 11 to *B. garinii*²¹. For each oMG strain, the proportion of isolates carrying at least one spirochete of that particular strain was calculated for each year and for the duration of the study. These proportions give the prevalence of each oMG strain in the subset of infected ticks. We use the term 'relative prevalence' to indicate that the proportion was calculated over the subset of infected ticks were excluded in the calculation of this proportion). The prevalence can range from 0.00 to 1.00 for any given oMG strain in any given year.

Relative prevalences differ among the oMG strains in *B. afzelii* and *B. garinii*. Proportion tests were used to determine whether the long-term average prevalences differed among oMG strains within each *Borrelia* species. The mean relative prevalences were significantly different between the 10 oMG strains in *B. afzelii* (proportion test: $\chi^2 = 280.512$, df = 9, p < 0.001; Fig. 1) and between the 11 oMG strains in *B. garinii* (proportion test: $\chi^2 = 179.018$, df = 10, p < 0.001; Fig. 1). In *B. afzelii*, the most common oMG (A10) was 11.7 times more common than the least common oMG (A3). In *B. garinii*, the most common oMG (G8) was 26.7 times more common than the least common oMG (G10).

Directional change in the relative prevalences of the oMG strains over time. The relative prevalence distribution of the oMG strains for the first six years of the study was significantly correlated with the relative prevalence distribution for the last five years of the study in both *B. afzelii* (Pearson correlation test: r = 0.869, p = 0.001; Fig. 2) and *B. garinii* (Pearson correlation test: r = 0.945, p < 0.001; Fig. 2). This result suggests that the community of oMG strains was the same between the two halves of the study, and that previously common strains did not become rare or vice versa. There was significant directional change in the relative prevalence between the start (2000 to 2005) and the end (2006 to 2010) of the study for 2 of the 20 oMGs (Table S2). *B. afzelii* oMGs A11 and A14 increased their relative prevalence by a factor of 4.0 (p = 0.009) and 1.8 (p = 0.027), respectively, between the start and the end of the study. However, after Bonferroni correction, none of the directional changes in relative prevalences between the start and the end of the study.

Stability of the relative prevalences of the oMG strains over time. The relative prevalences of the oMG strains were stable over time in both *B. afzelii* and *B. garinii* (Figures S1, S2, S3 and S4). There were 110 proportion tests for *B. afzelii* (10 oMGs * 11 years) and 99 proportion tests for *B. garinii* (9 oMGs * 11 years).



(A) B. afzelii

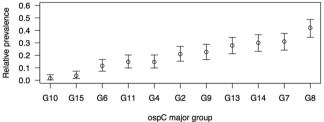


Figure 1. The relative prevalences differ significantly among the oMGs in (**A**) *B. afzelii* and in (**B**) *B. garinii*. For each species, the oMGs are ranked from least common to most common. The relative prevalence of an oMG strain is defined as the proportion of *B. afzelii*-infected nymphs that are infected with that particular oMG strain.

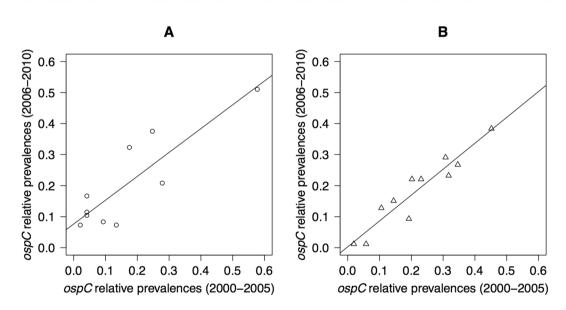
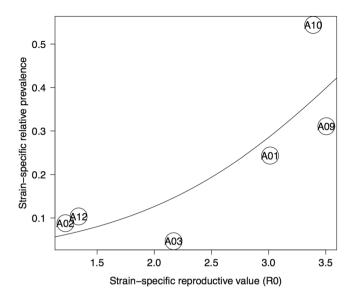
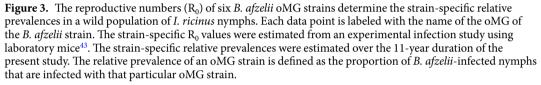


Figure 2. The community of oMG strains is stable over time. The relationship between the relative prevalences of the oMG strains of the first 6 years versus the last 5 years of the survey is shown for both (**A**) *B. afzelii* and (**B**) *B. garinii*. The Pearson correlation of the relative prevalence distribution of the oMG strains between the two time periods was highly significant for both *Borrelia* species. The relative prevalence of an oMG strain is defined as the proportion of *B. afzelii*-infected nymphs that are infected with that particular oMG strain.

Assuming a type I error rate of 0.05, we expect that there should be 0.05 * 209 = 10.45 proportion tests that are statistically significant for the two *Borrelia* species. Of the 209 proportion tests, only 11 annual prevalences were significantly different ($p < \alpha = 0.05$) from the average prevalence over the duration of the study (these years are marked with an asterisk in Figures S1, S2, S3 and S4). These 11 significant prevalences occurred in 6 different years and were distributed over 9 different oMG strains. The observed number of significant prevalences (11) was equal to the expected number of type I errors (10.45). This result supports the idea that the oMG strains did not fluctuate over time (Figures S3 and S4).





Relationship between the R_0 -values and the relative prevalences of the oMG strains in *B. afzelii*. For the six *B. afzelii* oMG strains for which we had data⁴³, there was a positive relationship between the strain-specific reproduction number (R_0) in laboratory mice and the strain-specific relative prevalence in the questing *I. ricinus* nymphs (GLM with binomial errors; $\chi^2 = 135.25$, dof = 1, p < 0.001; Fig. 3). After correcting for overdispersion, the relationship remained statistically significant (GLM with quasibinomial errors; $F_{1,4} = 10.019$, p = 0.034). The strain-specific R_0 value explained 70.24% of the variation in the strain-specific relative prevalences of the *B. afzelii* oMG strains in a wild population of *I. ricinus* nymphs.

Discussion

The most interesting result from this study was that our estimates of R_0 for six oMG strains of *B. afzelii* explained ~70% of the differences in prevalences among these strains in the field (Fig. 3). The strain-specific estimates of R_0 were calculated using the three most important fitness components for any vector-borne pathogen: vector-to-host transmission, systemic (host-to-vector) transmission, and co-feeding transmission. These pathogen fitness components, in turn, were estimated using a laboratory Lyme borreliosis system that used *Mus musculus* mice as the reservoir host and *Ixodes ricinus* ticks as the vector. Thus laboratory estimates of transmission combined into a single measure of fitness (R_0) were able to predict the community structure of this multiple-strain tick-borne pathogen in nature. Previous studies have used next generation matrix methods to estimate and compare R_0 values between different tick-borne pathogens (e.g. *Borrelia burgdorferi* versus tick-borne encephalitis virus) to enhance our understanding of their ecology and epidemiology^{18, 19, 46, 47}. Our study is an important demonstration that laboratory estimates of R_0 can predict the strain-specific prevalences of a vector-borne pathogen in the field.

We had previously tested the relationship between our laboratory estimates of R_0 and the relative prevalences of the oMG strains in the field, but the p-values were not significant⁴³. In that study⁴³, the prevalences of the oMG strains were obtained from the study by Pérez et al.³³, who had collected nymph-derived isolates from two field sites in Switzerland, which are different from the Bois de l'Hôpital site in the present study. The major improvements in the present study are as follows. First, the prevalences of the B. afzelii oMG strains are based on a larger sample size at a single site, whereas the study by Pérez et al.³³ had smaller sample sizes at two different sites. Second, we used 454-sequencing and the prevalences of the B. afzelii oMG strains were based on 114,432 ospC sequences, whereas in the study by Pérez et al.³³, the prevalences of the oMG strains were based on cold single-strand conformational polymorphism analysis. We have previously pointed out that the sensitivity of single-strand conformational polymorphism analysis is much lower than that of 454-sequencing^{21,42}. For example, for the subset of *B. afzelii*-infected questing nymphs, Pérez *et al.*³³ found that 1.5% carried multiple oMG strains, whereas we found that 78.8% carried multiple oMG strains²¹. Third, an implicit assumption underlying Fig. 3 is that the genetic backgrounds of the oMG strains used in the infection experiment of Tonetti et al.⁴³ are similar to the oMG strains in our local tick population. This assumption is more likely to be met in the present study, because 3 of the 6 B. afzelii oMG strains (A2, A9, and A10) used to estimate the strain-specific R₀ values in the infection experiment of Tonetti et al.⁴³ came from the same Bois de l'Hôpital field site used to estimate the oMG strain prevalences in Fig. 3.

Studies on human pathogens consisting of multiple-strains such as *Neisseria meningitidis* and *Streptococcus pneumoniae* have shown that the frequencies of these strains can remain constant over time¹⁴⁻¹⁶. Similarly, we found that the community of oMG strains was stable over time and that some strains were consistently more common than others (Figs 2 and 3, S1 and S2). This result was particularly striking in *B. afzelii* where A10 was the most common oMG strain in 10 of the 11 years of the study (Fig. 2). We point out that the present study finds no evidence for the prediction found in the Lyme borreliosis literature that common oMG strains should decrease in frequency over time because they are preferentially targeted by the vertebrate immune system^{22, 44, 45}. Previous studies on *B. burgdorferi* s. s. in *I. scapularis* ticks in the northeastern United States have documented rapid shifts in the prevalence distribution of the oMGs^{17, 48, 49}. However, these studies were either done in tick populations where *B. burgdorferi* s. s. was emerging⁴⁸ or over shorter time periods (3 years) using less reliable methods (single-strand conformational polymorphism analysis) for detecting multiple oMG strains in ticks^{17, 49}. The present study of two sympatric *Borrelia* species is exceptional because of its long duration and because of its focus on a local population at a single small field site where Lyme borreliosis is endemic.

There are two hypotheses that explain how the ospC gene polymorphism of *B. burgdorferi* s. l. pathogens is maintained in nature: balancing or frequency-dependent selection^{17, 35, 49, 50} and multiple niche polymorphism^{45, 51, 52}. In the frequency-dependent selection hypothesis, the vertebrate immune system is the mechanism that preferentially targets the most common strains and thereby prevents them from becoming too common^{22, 35, 45, 50}. The OspC protein is an immunodominant antigen that induces a strong antibody response that protects the vertebrate host from secondary infection^{53–57}. Protection is highly specific, and immunization with a given oMG antigen will only protect against infection with strains carrying the same oMG allele^{58–60}. In summary, an immune-based explanation for the ospC polymorphism is intuitive because the OspC protein resembles other highly variable pathogen surface antigens that are under immune-based selection^{61–64}.

Multiple niche polymorphism is the other hypothesis for the *ospC* polymorphism in *Borrelia* species^{45, 51}. In this hypothesis, the different oMG strains of the *Borrelia* pathogen are adapted to different vertebrate host species, which represent different ecological niches^{45, 51, 65}. The multiple niche polymorphism hypothesis was developed for *B. burgdorferi* s. s. in North America, which has a large host range^{22, 23}, but the evidence for this hypothesis is conflicted^{51, 52, 66}. *B. afzelii* has a much narrower host range than *B. burgdorferi* s. s. and is mostly associated with rodents^{31, 33, 34}. Host blood meal analysis of *I. ricinus* ticks at our field site in Switzerland found that the most important rodent species were *Apodemus* mice, the bank vole (*Myodes glareolus*), and the red squirrel (*Sciurus vulgaris*)^{67, 68}. With the exception of a system in France that contains an introduced species of chipmunk^{40, 41}, other studies on *B. afzelii* in Europe have found little support for the multiple niche polymorphism hypothesis^{33, 34, 39}. In the present study, the strain-specific estimates of R₀ were based on a single rodent species (*Mus musculus*) but were still highly predictive of the strain structure in the field. This result shows that it was not necessary to consider multiple host species and provides an indirect argument against the multiple niche polymorphism hypothesis.

A number of reviews on the ecology of Lyme borreliosis have predicted that the frequencies of the oMG strains should cycle under frequency-dependent selection^{22, 44, 45}. The present study found no evidence of cycles, but this result should not be interpreted as evidence against the frequency-dependent selection hypothesis. We point out here that immune-based models of selection on multiple-strain pathogens can produce all kinds of dynamics. Gupta and colleagues developed a number of theoretical models that explore how cross-reactive immune responses directed against immunodominant pathogen antigens (such as the OspC protein) influence the dynamics and community structure of multiple-strain pathogens⁶⁹⁻⁷¹. A key finding of these models is that strong selection on immunodominant antigens by the host immune system will cause the pathogen population to organize into a set of unique serotypes that minimizes cross-reactive acquired immunity⁷¹. In such systems, the community of strains can be stable over long periods of time and the prevalence of each strain depends on its reproduction number (R_0) as observed in the present study^{69,70}. With respect to another vector-borne parasite, the human malaria parasite Plasmodium falciparum, Gupta and colleagues suggested that, "many features of its epidemiology can be explained by assuming that it is a construct of 'independently transmitted strains^{69,72}". Similarly, Qiu *et al.*⁷³ suggested that the oMGs "could be viewed as evolutionarily stable "clonal complexes" within B. burgdorferi populations". In summary, we suggest that immune-mediated selection on the OspC antigen is the best explanation for the maintenance of the *ospC* polymorphism in nature.

Due to its critical role in host invasion^{74, 75}, the *ospC* gene has received much interest from a public health perspective. Genetic analysis of human isolates of *B. burgdorferi* s. l. revealed that only a subset of oMG strains is capable of infecting and causing disease in humans^{4, 76, 77}. In the United States, oMG strains A, B, K, I, and N are most commonly associated with disseminated infections in humans but these strains are also the most common in questing *I. scapularis* ticks⁷⁶. In the present study, strains carrying oMG A10 dominated the *B. afzelii* population in Neuchatel over the last decade (Fig. 1). Recent studies have shown that oMG strain A10 is common in other parts of Switzerland³³ and Sweden³¹. In contrast, genetic screening of human isolates has never recovered oMG A10 from a human patient^{36–38}. However, these genetic screens were based on a limited number of tissue biopsies (245 *ospC* sequences) that may have been sampled from areas in Europe where oMG A10 was not locally common^{36–38}. Future studies should screen human isolates of *B. afzelii* to test whether strains carrying this oMG are infectious to humans.

In conclusion, our study on two common Lyme borreliosis pathogens in a local population of *I. ricinus* ticks showed that the community of *Borrelia* oMG strains was stable over a period of 11 years. In both *B. afzelii* and *B. garinii*, some oMG strains were consistently common whereas other oMG strains were consistently rare. In *B. afzelii*, the strain-specific estimates of R_0 in laboratory rodents explained over 70% of the variation in the strain-specific prevalences in the field. Our results are consistent with theoretical models of how cross-reactive acquired immunity in the vertebrate host can determine the strain structure of pathogen populations^{69–71}. The

present study shows the importance of studying local pathogen populations over long periods of time to better understand their epidemiology.

Methods

Field sampling and molecular methods. The sampling of the *I. ricinus* ticks in the field, the testing for *Borrelia* infection, and the 454-sequencing of the single-copy *ospC* gene was described in a previous study²¹. Briefly, *I. ricinus* nymphs were sampled in a deciduous forest at the Bois de l'Hôpital site near the city of Neuchâtel (47°00′55.6″N, 6°94′16.7″E; surface of ~1 ha) over a period of 11 years (2000 to 2010). Nymphs were screened for spirochete infection using immunofluorescence microscopy and *Borrelia*-infected nymphs were incubated in BSK II medium at 34 °C. DNA was extracted from all spirochete-positive BSK cultures and the *Borrelia* species was identified using a PCR-reverse line blot assay that targets the 23S-5S spacer gene⁷⁸. The experimental design was described in a previous study²¹. Only those isolates that were singly infected with *B. afzelii* or *B. garinii* were selected for each of the 11 years of the survey for a total of 193 *B. afzelii* isolates and 190 *B. garinii* isolates. For each of these 383 isolates, the *ospC* gene was amplified using the PCR protocol of Bunikis *et al.*³⁶. 454-sequencing of the amplicons in the forward direction produced 240,410 useable *ospC* gene sequences (reads) and each sequence was 521 bp long. For each nymphal-tick derived isolate, the mean coverage was 632 *ospC* gene sequences (reads).

Identification of the *ospC* **major groups.** The *ospC* gene sequences can be classified into what are called *ospC* major groups (oMGs). The oMGs have a highly discrete pattern of genetic variation where each oMG is $\geq 8\%$ different in DNA sequence from all other oMGs^{35-38,42,51}. For the three Lyme borreliosis pathogens that have been most studied to date, *B. burgdorferi* s. s., *B. afzelii*, and *B. garinii*, each *Borrelia* species contains ~20 oMGs worldwide, with local populations often having 50% or more of this diversity^{17,21,35,36,38,40-42,51}. We had previously shown that all 240,410 *ospC* gene sequences clustered into 23 distinct oMGs that were 8% divergent from each other in DNA sequence²¹. Within each oMG, the DNA sequence variation was <2%²¹. We did not find any *ospC* gene sequences that were intermediately divergent (2–8%)²¹. This finding is important because it shows that the oMG alleles are real biological categories that are relatively robust to errors in sequencing or to changes in the clustering protocol. For example, changing the similarity threshold of our clustering protocol from 93–98% did not affect the number of unique oMGs in our dataset²¹.

Nomenclature of the oMGs of *B. afzelii* and *B. garinii*. In the literature, there are two different nomenclatures for the oMGs of *B. afzelii* and *B. garinii*^{36, 38}. In the present study, we used the nomenclature system that was developed by Bunikis *et al.*³⁶, and which has been used by others and we^{21, 31, 34, 42}. According to this nomenclature system, the 23 oMGs were as follows: 10 for *B. afzelii* (A1, A2, A3, A5, A7, A9, A10, A11, A12, and A14), 11 for *B. garinii* (G2, G4, G6, G7, G8, G9, G10, G11, G13, G14, and G15), 1 for *B. burgdorferi* s. s. (Q), and 1 for *B. valaisiana* (V1)²¹. The present study is restricted to the oMGs belonging to *B. afzelii* and *B. garinii*. In what follows, we will refer to a tick-derived isolate carrying a particular oMG allele as an oMG strain.

Calculation of the relative prevalences of the oMG strains over time. The community of oMG strains was determined for each of the 383 nymph-derived spirochete isolates as described previously²¹. An oMG was considered as present as long as the isolate contained a single sequence belonging to that group²¹. For each oMG strain, the annual relative prevalence was calculated as the proportion of nymph-derived spirochete isolates that carried that particular oMG that year²¹. In our previous study, we investigated patterns of oMG strain diversity in ticks and patterns of co-occurrence of oMG strains within ticks²¹. Those analyses combined all the data over the 11 years of the study and ignored temporal variation in the prevalences of the oMG strains, which is the focus of the present study.

Important assumptions of this study. This study makes three important assumptions. The first assumption is that the *ospC* gene is a reliable genetic marker for a given strain. The second assumption is that the step of culturing the *Borrelia* isolates in BSK media did not change the composition of the oMG strains. The third assumption is that the PCR protocol used to amplify the *ospC* gene was equally effective at amplifying all of the different oMG alleles. We address each of these three assumptions in the supplementary information.

Statistical Methods

Directional change in the relative prevalences of the oMG strains over time. To visualize whether the community of oMG strains changed between the first and second halves of the study, we compared the relative prevalences of the oMGs for the first six years (2000 to 2005) and for the last five years of the study (2006 to 2010). We used a Pearson's correlation test to determine whether there was a correlation in the relative prevalences of the oMG strains between these two periods of time. This test was done separately for *B. afzelii* and *B. garinii*. We used a proportion test to determine whether the relative prevalence of any of the oMG strains had changed between the first six years (2000 to 2005) and the last five years of the study (2006 to 2010). This approach allows us to detect large directional changes in relative prevalence over the duration of the study but not scenarios where the prevalences of the strains cycle within the 11-year period of the study.

Stability of the relative prevalences of the oMG strains over time. Previous reviews suggested that the oMG strains should cycle over time^{22, 44, 45}. If true, we would expect the years where a given strain is common or rare to deviate significantly from the long-term average of that strain over the course of the study. For each of the 10 *B. afzelii* oMGs (A1, A2, A3, A5, A7, A9, A10, A11, A12, and A14), we used a proportion test to determine whether its relative prevalence in a given year was significantly different from the average long-term relative prevalence of that strain over the duration of the study. We did the same for each of the 9 most common *B. garinii*

oMGs (G2, G4, G6, G7, G8, G9, G11, G13, and G14; oMGs G10 and G15 were too rare to be analysed). To test for the stability of the relative prevalences of the oMG strains, we summed the number of significant deviations from the long-term average for all the oMG strains belonging to the same *Borrelia* species. The observed number of significant deviations was then compared to the null hypothesis that deviations were caused by random binomial sampling error.

Relationship between R_0 and the relative prevalences of the oMG strains. The R_0 of an infection can be thought of as the number of cases one case generates, on average, over the course of its infectious period, in an otherwise uninfected population. In the absence of immunity-mediated competition between strains, theory predicts that the R_0 value of each strain will determine its prevalence in nature⁷⁰. We recently conducted a study where laboratory mice were experimentally infected via tick bite with one of six *B. afzelii* oMG strains: A1, A2, A3, A9, A10, and A12⁴³. To avoid confusion, we point out that Tonetti *et al.*⁴³ used the nomenclature developed by Lagal *et al.*³⁸ and Pérez *et al.*³³ and the six *B. afzelii* oMG strains in that study are therefore referred to as A2, ME, A3, A1, YU, and A4, respectively. The purity of these six strains was recently confirmed by 454-sequencing of the *ospC* gene (Table S1). Importantly, three of these isolates, A2, A9, and A10, were obtained from the Neuchâtel area, whereas isolates A1, A3, and A12 were obtained from Thune (Switzerland), Austria, and Germany respectively. For each of the six strains, the following three fitness components were measured: tick-to-host transmission, systemic (host-to-tick) transmission, and co-feeding transmission⁴³.

We used next generation matrix methods^{18,46,47} to combine these transmission components into the reproduction number (R_0) for each of the six *B. afzelii ospC* strains⁴³. The study of Tonetti *et al.*⁴³ assumed that the efficiency of vertical transmission (r_A) was 0.10 and that the proportion of competent hosts (h_c) was 0.50. Recent work suggests that transovarial transmission of *B. burgdorferi* s. I. does not occur in *Ixodes* ticks^{79,80} and the value of r_A was therefore set to 0.00 in the present study. Host blood meal analysis in our local Lyme borreliosis system suggests that only 28.0% of questing immature *I. ricinus* ticks obtained their blood meal from *B. afzelii*-competent rodent reservoir hosts⁶⁸, and the value of h_c was therefore set to 0.28 in the present study. Thus the estimates of R_0 for the six strains of *B. afzelii* are similar but not identical between Tonetti *et al.*⁴³ and the present study. We used a generalized liner model (GLM) with binomial errors to test whether there was a positive relationship between the R_0 values of the six *B. afzelii ospC* strains and the strain-specific relative prevalences in the local *I. ricinus* population (averaged over the entire course of the study). We calculated the associated r^2 using the McFadden's pseudo r^2 method.

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Author Contributions

J.D. and M.J.V. designed the study, analysed the data, and wrote the manuscript. L.G. designed the tick sampling survey, screened the isolates for *Borrelia* infection, and edited the manuscript. O.R. sampled the ticks in the field and determined *Borrelia* infection via the reverse line blot assay. J.D. performed the library preparation and the clustering analysis of the *ospC* gene sequences into the oMGs. M.J. participated in the library preparation of the samples. All authors read and approved the manuscript.

Additional Information

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Competing Interests: The authors declare that they have no competing interests.

Accession Codes: The *ospC* gene sequence data have been deposited in the Sequence Read Archive under BioProject PRJNA293785 with the accession number SRP063760.

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